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TRADING STRATEGIES

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*ZK: To my mother Mila and my children Mirabelle and Maximilien
JAS: To my parents, Claudio and Andrea, and my brother Emiliano*

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Acronyms

ABS	Asset-Backed Security
ADDV	Average Daily Dollar Volume
ANN	Artificial Neural Network
ATM	At-The-Money
B/P	Book-to-Price
BA	Banker's Acceptance
BICS	Bloomberg Industry Classification System
bps	Basis point
BTC	Bitcoin
Btu	British thermal unit
CA	Commodity allocation percentage
CBOE	Chicago Board Options Exchange
CD	Certificate of Deposit
CDD	Cooling-Degree-Days
CDO	Collateralized Debt Obligation
CDS	Credit Default Swap
CFTC	U.S. Commodity Futures Trading Commission
CI	Core Inflation
CIRP	Covered Interest Rate Parity
CME	Chicago Mercantile Exchange
COT	Commitments of Traders
CPI	Consumer Price Index
CPS	Cents-Per-Share
CTA	Commodity Trading Advisor
DJIA	Dow Jones Industrial Average
EMA	Exponential Moving Average
EMSD	Exponential Moving Standard Deviation

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ETF	Exchange-Traded Fund
ETH	Ethereum
ETN	Exchange-Traded Note
EUR	Euro
FOMC	Federal Open Market Committee
FX	Foreign exchange
GDP	Gross Domestic Product
GICS	Global Industry Classification Standard
HDD	Heating-Degree-Days
HFT	High Frequency Trading
HI	Headline Inflation
HMD	Healthy-Minus-Distressed
HML	High Minus Low
HP	Hedging pressure; Hodrick-Prescott
IBS	Internal Bar Strength
ITM	In-The-Money
JPY	Japanese Yen
LETF	Leveraged (inverse) ETF
LIBOR	London Interbank Offer Rate
M&A	Mergers and Acquisitions
MA	Moving Average
ML	Machine Learning
MBS	Mortgage-Backed Security
MBtu	1000 Btu
MKT	Market (excess) return
MMBtu	1,000,000 Btu
MOM	Carhart's momentum factor
MSA	Metropolitan Statistical Area
MTM	Mark-To-Market
Mwh	Megawatt hour
NYSE	New York Stock Exchange
OAS	Option Adjusted Spread
OTM	Out-of-the-Money
P&L	Profit(s) and Loss(es)
P2P	Peer-to-Peer
PCA	Principal Component Analysis
REIT	Real Estate Investment Trust
ReLU	Rectified linear unit
REPO/repo	Repurchase agreement
RMSE	Root Mean Square Error
RSI	Relative Strength Index
S&P	Standard and Poor's
SIC	Standard Industrial Classification

SMA	Simple Moving Average
SMB	Small Minus Big
SGD	Stochastic Gradient Descent
SS	Sum of Squares
StatArb	Statistical Arbitrage
STRIPS	Separate Trading of Registered Interest and Principal of Securities
SUE	Standardized Unexpected Earnings
SVM	Support Vector Machine
TTM	Time-To-Maturity
TIPS	Treasury Inflation-Protected Securities
UIRP	Uncovered Interest Rate Parity
USD	U.S. Dollar
VAR	Vector Autoregressive Model
VWAP	Volume-Weighted Average Price
YoY	Year-on-Year

Some Math Notations

iff	If and only if
max (min)	Maximum (minimum)
floor (x)	The largest integer less than or equal x
ceiling (x)	The smallest integer greater than or equal x
$(x)^+$	$\max(x, 0)$
sign(x)	Sign of x , defined as: $+1$ if $x > 0$; -1 if $x < 0$; 0 if $x = 0$
$ x $	Absolute value of x if x is a real number
rank(x_i)	Rank of x_i when N values x_i ($i = 1, \dots, N$) are sorted in the ascending order
$\exp(x)$ or e^x	Natural exponent of x
$\ln(x)$	Natural log of x
$\sum_{i=1}^N x_i$	Sum of N values x_i ($i = 1, \dots, N$)
$\prod_{i=1}^N x_i$	Product of N values x_i ($i = 1, \dots, N$)
$A _{B=b}$ (or $A _b$)	The value of A when some quantity B it implicitly depends on (usually evident from the context) takes value b
$f(x) \rightarrow \min$ (max)	Minimizing (maximizing) $f(x)$ w.r.t. x (where x can, e.g., be an N -vector x_i , $i = 1, \dots, N$)
$\operatorname{argmax}_z f(z)$	The value of z for which $f(z)$ is maximized
$\partial f / \partial x$	The first partial derivative of the function f (which may depend on variables other than x) w.r.t. x
$\partial^2 f / \partial x^2$	The second partial derivative of the function f (which may depend on variables other than x) w.r.t. x
$G : A \mapsto B$	G is a map from set A to set B
$A \subset B$	Set A is a subset of set B

xx **Some Math Notations**

$\{i f(i) = a\}$	The set of values of i such that the condition $f(i) = a$ is satisfied
$\min(i : f(i) > a)$	The minimum value of i such that the condition $f(i) > a$ is satisfied
$i \in J$	i is an element of set J
$ J $	the number of elements of J if J is a finite set
δ_{AB} (or $\delta_{A,B}$)	1 if $A = B$; otherwise, 0 (Kronecker delta)
$\text{diag}(x_i)$	Diagonal $N \times N$ matrix with x_i ($i = 1, \dots, N$) on its diagonal
A^T	Transpose of matrix A
A^{-1}	Inverse of matrix A
$E_t(A)$	Expected value of A at time t
$dX(t)$	An infinitesimal increment of a continuous process $X(t)$
dt	An infinitesimal increment of time t
$P(A B)$	Conditional probability of A occurring assuming B is true

1

Introduction and Summary

A trading strategy can be defined as a set of instructions to achieve certain asset holdings by some predefined times t_1, t_2, \dots , which holdings can (but need not) be null at one or more of these times. In many cases, the main objective of a trading strategy is to make a profit, i.e., to generate a positive return on its investment. However, some viable trading strategies are not always outright profitable as stand-alone strategies. E.g., a hedging strategy can be a part of a bigger plan, which itself can but need not be a trading strategy. Thus, an airline hedging against rising fuel costs with commodity futures is a trading strategy, which is a risk management step in executing the airline's business strategy of generating profits through its services.

In the case of trading strategies that are intended to be outright profitable as stand-alone strategies, one may argue that the phrase “buy low, sell high” captures their essence. However, this viewpoint is somewhat superfluous and, while it applies to trading strategies that buy and sell a single asset (e.g., a single stock), it would exclude a whole host of viable strategies that do not work quite like that. E.g., a trading strategy that uses a hedging sub-strategy for risk management may not always “buy low, sell high” when it comes to a particular asset in its portfolio. This is because hedging risk—or, essentially, transferring some risk to other market participants—is not free, and often a trader will pay a premium for hedging some risks in a trading strategy to achieve its objectives. Another example would be the so-called statistical arbitrage, wherein the trading portfolio can consist of, e.g., thousands of stocks and profitability is typically not achieved by buying low and selling high each stock or even any discernable groups of stocks, but statistically, across all stocks, with some trades making money and some losing it. It gets complicated quickly.

The purpose of these notes is to collect a variety of trading strategies in the context of finance (as opposed to trading baseball cards, classic cars, etc.) across essentially all (or at least most frequently encountered) asset classes. Here we deliberately use the term “asset class” somewhat loosely and include what can be referred to as “asset sub-classes”. Thus, a narrower definition would include stocks, bonds, cash, currencies, real estate, commodities, and infrastructure. However, this definition would be too narrow for our purposes here. We also consider: derivatives such as options and futures; exchange-traded funds (ETFs); indexes (which are usually traded through vehicles such as ETFs and futures); volatility, which can be treated as an asset class (and traded via, among other things, exchange-traded notes); structured assets (such as collateralized debt obligations and mortgage-backed securities); convertible bonds (which represent a hybrid between bonds and stocks); distressed assets (which are not a separate asset class per se, but the corresponding trading strategies are rather distinct); cryptocurrencies; miscellaneous assets such as weather and energy (derivatives); and also trading strategies such as tax arbitrage and global macro (which use some assets mentioned above as tradables). Some strategies are relatively simple and can be described in words, while many (in fact, most) require a much more detailed mathematical description, which we provide formulaically.

It is important to bear in mind that, unlike the laws of nature (physics), which (apparently) are set in stone and do not change in time, financial markets are man-made and change essentially continuously, and at times quite dramatically. One of the consequences of this transiency is that trading strategies that may have worked well for some time, may die, sometimes quite abruptly. E.g., when the New York Stock Exchange (NYSE) started switching away from its human-operated “specialist” system to electronic trading beginning late 2006,¹ many statistical arbitrage strategies that were profitable for years prior to that, pretty much died overnight as volatility increased and what used to do the trick before no longer did. Eventually, the market was flooded with high-frequency trading (HFT)² strategies further diminishing profit margins of many “good old” trading strategies and killing them.

However, technological advances gave rise to new types of trading, including ubiquitous trading strategies based on data mining and machine learning, which seek to identify—typically quite ephemeral—signals or trends by analyzing large volumes of diverse types of data. Many of these trading signals are

¹NYSE first started with its “Hybrid Market” (see, e.g., Hendershott and Moulton 2011). However, the writing had been on the wall for the ultimate demise of the specialist system for quite some time. For a timeline, see, e.g., Pisani (2010).

²See, e.g., Aldridge (2013), Lewis (2014).

so faint that they cannot be traded on their own, so one combines thousands, in fact, tens or even hundreds of thousands if not millions of such signals with nontrivial weights to amplify and enhance the overall signal such that it becomes tradable on its own and profitable after trading costs and slippage, including that inflicted by HFT.³

Considering the intrinsically ephemeral nature of the financial markets and trading strategies designed to make a profit therefrom, the purpose of these notes is *not* to convey to the reader how to make money using any trading strategy but simply to provide information on and give some flavor of what kind of trading strategies people have considered across a broad cross-section of asset classes and trading styles. In light of the foregoing, we make the following **DISCLAIMER**: *Any information or opinions provided herein are for informational purposes only and are not intended, and shall not be construed, as an investment, legal, tax or any other such advice, or an offer, solicitation, recommendation or endorsement of any trading strategy, security, product or service.* For further legal disclaimers, see Appendix B hereof.

We hope these notes will be useful to academics, practitioners, students and aspiring researchers/traders for years to come. These notes intentionally—not to duplicate prior literature and to avoid this manuscript spanning thousands of pages—do not contain any numeric simulations, backtests, empirical studies, etc. However, we do provide an eclectic cornucopia of references, including those with detailed empirical analyses. Our purpose here is to describe, in many cases in sizable detail, various trading strategies. Also, Appendix A provides source code for illustrating out-of-sample backtesting (see Appendix B for legalese).⁴ So, we hope you enjoy!

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³See, e.g., Kakushadze and Tulchinsky (2016), Kakushadze and Yu (2017).

⁴The code in Appendix A is not written to be “fancy” or optimized for speed or otherwise.

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2

Options

2.1 Generalities

An option is a form of a financial derivative. It is a contract sold by the option writer to the option holder. Typically, an option gives the option holder the right, but not the obligation, to buy or sell an underlying security or financial asset (e.g., a share of common stock) at an agreed-upon price (referred to as the strike price) during a certain period of time or on a specific date (referred to as the exercise date). A buyer pays a premium to the seller for the option. For option pricing, see, e.g., Harrison and Pliska (1981), Baxter and Rennie (1996), Hull (2012), Kakushadze (2015).

A European call option is a right (but not an obligation) to buy a stock at the maturity time T for the strike price k agreed on at time $t = 0$. The claim for the call option $f^{call}(S_T, k) = (S_T - k)^+$. Here $(x)^+ = x$ if $x > 0$, and $(x)^+ = 0$ if $x \leq 0$. By the “claim” we mean how much the option is worth at maturity T . If the stock price at maturity $S_T > k$, then the option holder gains $S_T - k$ (excluding the cost paid for the option at $t = 0$). If the price at maturity $S_T \leq k$, then there is no profit to be made from the option as it makes no sense to exercise it if $S_T < k$ (as it is cheaper to buy the stock in the market) and it makes no difference if $S_T = k$ —all this is assuming no transaction costs. Similarly, a European put option is a right (but not an obligation) to sell a stock at the maturity time T for the strike price k agreed on at time $t = 0$. The claim for the put option is given by $f^{put}(S_T, k) = (k - S_T)^+$.

Options can be issued on a variety of underlying assets, e.g., equities (single-stock options), bonds, futures, indexes, commodities, currencies, etc. For the sake of terminological convenience and definiteness, in the following we will

frequently refer to the underlying asset as “stock”, even though in many cases the discussion can be readily generalized to other assets. Furthermore, there is a variety of option styles (beyond European options—for European options, see, e.g., Black and Scholes [1973]), e.g., American options (that can be exercised on any trading day on or before expiration—see, e.g., Kim [1990]), Bermudan options (that can be exercised only on specified dates on or before expiration—see, e.g., Andersen [1999]), Canary options (that can be exercised, say, quarterly, but not before a determined time period, say, 1 year, has elapsed—see, e.g., Henrard [2006]), Asian options (whose payoff is determined by the average underlying price over some preset time period—see, e.g., Rogers and Shi [1995]), barrier options (which can be exercised only if the underlying security’s price passes a certain level or “barrier”—see, e.g., Haug [2001]), other exotic options (a broad category of options that typically are complexly structured—see, e.g., Fabozzi [2002]), etc. Let us also mention binary (a.k.a. all-or-nothing or digital) options (that pay a preset amount, say, \$1, if the underlying security meets a predefined condition on expiration, otherwise they simply expire without paying anything to the holder—see, e.g., Breeden and Litzenberger [1978]).

Some trading strategies can be built using, e.g., combinations of options. Such trading strategies can be divided into two groups: directional and non-directional. Directional strategies imply an expectation on the direction of the future stock price movements. Non-directional (a.k.a. neutral) strategies are not based on the future direction: the trader is oblivious to whether the stock price goes up or down.

Directional strategies can be divided into two subgroups: (i) bullish strategies, where the trader profits if the stock price goes up; and (ii) bearish strategies, where the trader profits if the stock price goes down. Non-directional strategies can be divided into two subgroups: (a) volatility strategies that profit if the stock has large price movements (high volatility environment); and (b) sideways strategies that profit if the stock price remains stable (low volatility environment). Also, one can distinguish income, capital gain, hedging strategies, etc. (see, e.g., Cohen 2005).

In the remainder of this section, unless stated otherwise, all options are for the same stock and have the same time-to-maturity (TTM). The moneyness abbreviations are: ATM = at-the-money, ITM = in-the-money, OTM = out-of-the-money. Also: f_T is the payoff at maturity T ; S_0 is the stock price at the time $t = 0$ of entering the trade (i.e., establishing the initial position); S_T is the stock price at maturity; C is the net credit received at $t = 0$, and D is the net debit required at $t = 0$, as applicable; $H = D$ (for a net debit trade)

or $H = -C$ (for a net credit trade)¹; S_{*up} and S_{*down} are the higher and lower break-even (i.e., for which $f_T = 0$) stock prices at maturity; if there is only one break-even price, it is denoted by S_* ; P_{max} is the maximum profit at maturity; L_{max} is the maximum loss at maturity.

2.2 Strategy: Covered Call

This strategy (a.k.a. “buy-write” strategy) amounts to buying stock and writing a call option with a strike price K against the stock position. The trader’s outlook on the stock price is neutral to bullish. The covered call strategy has the same payoff as writing a put option (short/naked put).² While maintaining the long stock position, the trader can generate income by periodically selling OTM call options. We have³:

$$f_T = S_T - S_0 - (S_T - K)^+ + C = K - S_0 - (K - S_T)^+ + C \quad (2.1)$$

$$S_* = S_0 - C \quad (2.2)$$

$$P_{max} = K - S_0 + C \quad (2.3)$$

$$L_{max} = S_0 - C \quad (2.4)$$

2.3 Strategy: Covered Put

This strategy (a.k.a. “sell-write” strategy) amounts to shorting stock and writing a put option with a strike price K against the stock position. The trader’s outlook is neutral to bearish. The covered put strategy has the same payoff as writing a call option (short/naked call). While maintaining the short stock position, the trader can generate income by periodically selling OTM put options. We have⁴:

$$f_T = S_0 - S_T - (K - S_T)^+ + C = S_0 - K - (S_T - K)^+ + C \quad (2.5)$$

$$S_* = S_0 + C \quad (2.6)$$

¹ H is the net debit for all bought option premia less the net credit for all sold option premia.

² This is related to put-call parity (see, e.g., Stoll 1969; Hull 2012).

³ For some literature on covered call strategies, see, e.g., Pounds (1978), Whaley (2002), Feldman and Roy (2004), Hill et al. (2006), Kapadia and Szado (2007), Che and Fung (2011), Mugwagwa et al. (2012), Israelov and Nielsen (2014, 2015a), Hemler and Miller (2015).

⁴ The covered put option strategy is symmetrical to the covered call option strategy. Academic literature on the covered put option strategy appears to be scarce. See, e.g., Che (2016).

$$P_{max} = S_0 - K + C \quad (2.7)$$

$$L_{max} = \text{unlimited} \quad (2.8)$$

2.4 Strategy: Protective Put

This strategy (a.k.a. “married put” or “synthetic call”) amounts to buying stock and an ATM or OTM put option with a strike price $K \leq S_0$. The trader’s outlook is bullish. This is a hedging strategy: the put option hedges the risk of the stock price falling. We have⁵:

$$f_T = S_T - S_0 + (K - S_T)^+ - D = K - S_0 + (S_T - K)^+ - D \quad (2.9)$$

$$S_* = S_0 + D \quad (2.10)$$

$$P_{max} = \text{unlimited} \quad (2.11)$$

$$L_{max} = S_0 - K + D \quad (2.12)$$

2.5 Strategy: Protective Call

This strategy (a.k.a. “married call” or “synthetic put”) amounts to shorting stock and buying an ATM or OTM call option with a strike price $K \geq S_0$. The trader’s outlook is bearish. This is a hedging strategy: the call option hedges the risk of the stock price rising. We have⁶:

$$f_T = S_0 - S_T + (S_T - K)^+ - D = S_0 - K + (K - S_T)^+ - D \quad (2.13)$$

$$S_* = S_0 - D \quad (2.14)$$

$$P_{max} = S_0 - D \quad (2.15)$$

$$L_{max} = K - S_0 + D \quad (2.16)$$

2.6 Strategy: Bull Call Spread

This is a vertical spread consisting of a long position in a close to ATM call option with a strike price K_1 , and a short position in an OTM call option

⁵For some literature on protective put strategies, see, e.g., Figlewski et al. (1993), Israelov and Nielsen (2015b), Israelov et al. (2017), Israelov (2017).

⁶The protective call option strategy is symmetrical to the protective put option strategy. Academic literature on the protective call option strategy appears to be scarce. See, e.g., Jabbour and Budwick (2010), Tokic (2013).

with a higher strike price K_2 . This is a net debit trade. The trader's outlook is bullish: the strategy profits if the stock price rises. This is a capital gain strategy. We have⁷:

$$f_T = (S_T - K_1)^+ - (S_T - K_2)^+ - D \quad (2.17)$$

$$S_* = K_1 + D \quad (2.18)$$

$$P_{max} = K_2 - K_1 - D \quad (2.19)$$

$$L_{max} = D \quad (2.20)$$

2.7 Strategy: Bull Put Spread

This is a vertical spread consisting of a long position in an OTM put option with a strike price K_1 , and a short position in another OTM put option with a higher strike price K_2 . This is a net credit trade. The trader's outlook is bullish. This is an income strategy. We have:

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ + C \quad (2.21)$$

$$S_* = K_2 - C \quad (2.22)$$

$$P_{max} = C \quad (2.23)$$

$$L_{max} = K_2 - K_1 - C \quad (2.24)$$

2.8 Strategy: Bear Call Spread

This is a vertical spread consisting of a long position in an OTM call option with a strike price K_1 , and a short position in another OTM call option with a lower strike price K_2 . This is a net credit trade. The trader's outlook is bearish. This is an income strategy. We have:

$$f_T = (S_T - K_1)^+ - (S_T - K_2)^+ + C \quad (2.25)$$

$$S_* = K_2 + C \quad (2.26)$$

$$P_{max} = C \quad (2.27)$$

$$L_{max} = K_1 - K_2 - C \quad (2.28)$$

⁷For some literature on bull/bear call/put vertical spreads, see, e.g., Cartea and Pedraz (2012), Chaput and Ederington (2003, 2005), Chen et al. (1999), Cong et al. (2013, 2014), Matsypura and Timkovsky (2010), Shah (2017), Wong et al. (2011), Zhang (2015). Also see Clarke et al. (2013), Cohen (2005), Jabbour and Budwick (2010), McMillan (2002), The Options Institute (1995).

2.9 Strategy: Bear Put Spread

This is a vertical spread consisting of a long position in a close to ATM put option with a strike price K_1 , and a short position in an OTM put option with a lower strike price K_2 . This is a net debit trade. The trader's outlook is bearish: this strategy profits if the stock price falls. This is a capital gain strategy. We have:

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ - D \quad (2.29)$$

$$S_* = K_1 - D \quad (2.30)$$

$$P_{max} = K_1 - K_2 - D \quad (2.31)$$

$$L_{max} = D \quad (2.32)$$

2.10 Strategy: Long Synthetic Forward

This strategy amounts to buying an ATM call option and selling an ATM put option with a strike price $K = S_0$. This can be a net debit or net credit trade. Typically, $|H| \ll S_0$. The trader's outlook is bullish: this strategy mimics a long stock or futures position; it replicates a long forward contract with the delivery price K and the same maturity as the options. This is a capital gain strategy. We have⁸:

$$f_T = (S_T - K)^+ - (K - S_T)^+ - H = S_T - K - H \quad (2.33)$$

$$S_* = K + H \quad (2.34)$$

$$P_{max} = \text{unlimited} \quad (2.35)$$

$$L_{max} = K + H \quad (2.36)$$

2.11 Strategy: Short Synthetic Forward

This strategy amounts to buying an ATM put option and selling an ATM call option with a strike price $K = S_0$. This can be a net debit or net credit trade. Typically, $|H| \ll S_0$. The trader's outlook is bearish: this strategy mimics a short stock or futures position; it replicates a short forward contract with the

⁸For some literature on long/short synthetic forward contracts (a.k.a. synthetic futures), see, e.g., Benavides (2009), Bozic and Fortenbery (2012), DeMaskey (1995), Ebrahim and Rahman (2005), Nandy and Chattopadhyay (2016).

delivery price K and the same maturity as the options. This is a capital gain strategy. We have:

$$f_T = (K - S_T)^+ - (S_T - K)^+ - H = K - S_T - H \quad (2.37)$$

$$S_* = K - H \quad (2.38)$$

$$P_{max} = K - H \quad (2.39)$$

$$L_{max} = \text{unlimited} \quad (2.40)$$

2.12 Strategy: Long Combo

This strategy (a.k.a. “long risk reversal”) amounts to buying an OTM call option with a strike price K_1 and selling an OTM put option with a strike price K_2 . The trader’s outlook is bullish. This is a capital gain strategy.⁹ We have ($K_1 > K_2$):

$$f_T = (S_T - K_1)^+ - (K_2 - S_T)^+ - H \quad (2.41)$$

$$S_* = K_1 + H, \quad H > 0 \quad (2.42)$$

$$S_* = K_2 + H, \quad H < 0 \quad (2.43)$$

$$K_2 \leq S_* \leq K_1, \quad H = 0 \quad (2.44)$$

$$P_{max} = \text{unlimited} \quad (2.45)$$

$$L_{max} = K_2 + H \quad (2.46)$$

2.13 Strategy: Short Combo

This strategy (a.k.a. “short risk reversal”) amounts to buying an OTM put option with a strike price K_1 and selling an OTM call option with a strike price K_2 . The trader’s outlook is bearish. This is a capital gain strategy. We have ($K_2 > K_1$):

$$f_T = (K_1 - S_T)^+ - (S_T - K_2)^+ - H \quad (2.47)$$

$$S_* = K_1 - H, \quad H > 0 \quad (2.48)$$

$$S_* = K_2 - H, \quad H < 0 \quad (2.49)$$

$$K_1 \leq S_* \leq K_2, \quad H = 0 \quad (2.50)$$

⁹For some literature on long/short combo strategies, see, e.g., Rusnáková et al. (2015), Šoltés (2011), Šoltés and Rusnáková (2012). Also see, e.g., Chaput and Ederington (2003).

$$P_{max} = K_1 - H \quad (2.51)$$

$$L_{max} = \text{unlimited} \quad (2.52)$$

2.14 Strategy: Bull Call Ladder

This is a vertical spread consisting of a long position in (usually) a close to ATM call option with a strike price K_1 , a short position in an OTM call option with a strike price K_2 , and a short position in another OTM call option with a higher strike price K_3 . A bull call ladder is a bull call spread financed by selling another OTM call option (with the strike price K_3).¹⁰ This adjusts the trader's outlook from bullish (bull call spread) to conservatively bullish or even non-directional (with an expectation of low volatility). We have:

$$f_T = (S_T - K_1)^+ - (S_T - K_2)^+ - (S_T - K_3)^+ - H \quad (2.53)$$

$$S_{*down} = K_1 + H, \quad H > 0 \quad (2.54)$$

$$S_{*up} = K_3 + K_2 - K_1 - H \quad (2.55)$$

$$P_{max} = K_2 - K_1 - H \quad (2.56)$$

$$L_{max} = \text{unlimited} \quad (2.57)$$

2.15 Strategy: Bull Put Ladder

This is a vertical spread consisting of a short position in (usually) a close to ATM put option with a strike price K_1 , a long position in an OTM put option with a strike price K_2 , and a long position in another OTM put option with a lower strike price K_3 . A bull put ladder typically arises when a bull put spread (a bullish strategy) goes wrong (the stock trades lower), so the trader buys another OTM put option (with the strike price K_3) to adjust the position to bearish. We have¹¹:

$$f_T = (K_3 - S_T)^+ + (K_2 - S_T)^+ - (K_1 - S_T)^+ - H \quad (2.58)$$

$$S_{*up} = K_1 + H, \quad H < 0 \quad (2.59)$$

$$S_{*down} = K_3 + K_2 - K_1 - H \quad (2.60)$$

¹⁰In this sense, this is an "income" strategy.

¹¹For some literature on ladder strategies, see, e.g., Amaitiek et al. (2010), Harčariková and Šoltés (2016), He et al. (2016), Šoltés and Amaitiek (2010a).

$$P_{max} = K_3 + K_2 - K_1 - H \quad (2.61)$$

$$L_{max} = K_1 - K_2 + H \quad (2.62)$$

2.16 Strategy: Bear Call Ladder

This is a vertical spread consisting of a short position in (usually) a close to ATM call option with a strike price K_1 , a long position in an OTM call option with a strike price K_2 , and a long position in another OTM call option with a higher strike price K_3 . A bear call ladder typically arises when a bear call spread (a bearish strategy) goes wrong (the stock trades higher), so the trader buys another OTM call option (with the strike price K_3) to adjust the position to bullish. We have:

$$f_T = (S_T - K_3)^+ + (S_T - K_2)^+ - (S_T - K_1)^+ - H \quad (2.63)$$

$$S_{*down} = K_1 - H, \quad H < 0 \quad (2.64)$$

$$S_{*up} = K_3 + K_2 - K_1 + H \quad (2.65)$$

$$P_{max} = \text{unlimited} \quad (2.66)$$

$$L_{max} = K_2 - K_1 + H \quad (2.67)$$

2.17 Strategy: Bear Put Ladder

This is a vertical spread consisting of a long position in (usually) a close to ATM put option with a strike price K_1 , a short position in an OTM put option with a strike price K_2 , and a short position in another OTM put option with a lower strike price K_3 . A bear put ladder is a bear put spread financed by selling another OTM put option (with the strike price K_3).¹² This adjusts the trader's outlook from bearish (bear put spread) to conservatively bearish or even non-directional (with an expectation of low volatility). We have (assuming $K_3 + K_2 - K_1 + H > \max(H, 0)$):

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ - (K_3 - S_T)^+ - H \quad (2.68)$$

$$S_{*up} = K_1 - H, \quad H > 0 \quad (2.69)$$

$$S_{*down} = K_3 + K_2 - K_1 + H \quad (2.70)$$

¹²In this sense, as for the bull call ladder, this is an "income" strategy.

$$P_{max} = K_1 - K_2 - H \quad (2.71)$$

$$L_{max} = K_3 + K_2 - K_1 + H \quad (2.72)$$

2.18 Strategy: Calendar Call Spread

This is a horizontal spread consisting of a long position in a close to ATM call option with TTM T' and a short position in another call option with the same strike price K but shorter TTM $T < T'$. This is a net debit trade. The trader's outlook is neutral to bullish. At the expiration of the short call option ($t = T$), the best case scenario is if the stock price is right at the strike price ($S_T = K$). At $t = T$ let V be the value of the long call option (expiring at $t = T'$) assuming $S_T = K$. We have¹³:

$$P_{max} = V - D \quad (2.73)$$

$$L_{max} = D \quad (2.74)$$

If at the expiration of the short call option the stock price $S_{stop-loss} \leq S_T \leq K$, where $S_{stop-loss}$ is the stop-loss price below which the trader would unwind the entire position, then the trader can write another call option with the strike price K and TTM $T_1 < T'$. While maintaining the long position in the call option with TTM T' , the trader can generate income by periodically selling call options with shorter maturities. In this regard, this strategy resembles the covered call strategy.

2.19 Strategy: Calendar Put Spread

This is a horizontal spread consisting of a long position in a close to ATM put option with TTM T' and a short position in another put option with the same strike price K but shorter TTM $T < T'$. This is a net debit trade. The trader's outlook is neutral to bearish. At the expiration of the short put option ($t = T$), the best case scenario is if the stock price is right at the strike price

¹³For some literature on calendar/diagonal call/put spreads, see, e.g., Carmona and Durrleman (2003), Carr and Javaheri (2005), Dale and Currie (2015), Gatheral and Jacquier (2014), Kawaller et al. (2002), Liu and Tang (2010), Manoliu (2004), Pirrong (2017), Till (2008).

($S_T = K$). At $t = T$ let V be the value of the long put option (expiring at $t = T'$) assuming $S_T = K$. We have:

$$P_{max} = V - D \quad (2.75)$$

$$L_{max} = D \quad (2.76)$$

If at the expiration of the short put option the stock price $K \leq S_T \leq S_{stop-loss}$, where $S_{stop-loss}$ is the stop-loss price above which the trader would unwind the entire position, then the trader can write another put option with the strike price K and TTM $T_1 < T'$. While maintaining the long position in the put option with TTM T' , the trader can generate income by periodically selling put options with shorter maturities. In this regard, this strategy resembles the covered put strategy.

2.20 Strategy: Diagonal Call Spread

This is a diagonal spread consisting of a long position in a deep ITM call option with a strike price K_1 and TTM T' , and a short position in an OTM call option with a strike price K_2 and shorter TTM $T < T'$. This is a net debit trade. The trader's outlook is bullish. At $t = T$ let V be the value of the long call option (expiring at $t = T'$) assuming $S_T = K$. We have:

$$P_{max} = V - D \quad (2.77)$$

$$L_{max} = D \quad (2.78)$$

If at the expiration of the short call option the stock price $S_{stop-loss} \leq S_T \leq K_2$, where $S_{stop-loss}$ is the stop-loss price below which the trader would unwind the entire position, then the trader can write another OTM call option with TTM $T_1 < T'$. While maintaining the long position in the call option with TTM T' , the trader can generate income by periodically selling OTM call options with shorter maturities. In this regard, this strategy is similar to the calendar call spread. The main difference is that, in the diagonal call spread the deep ITM call option (unlike the close to ATM call option in the calendar call spread) more closely mimics the underlying stock, so the position is more protected against a sharp rise in the stock price.

2.21 Strategy: Diagonal Put Spread

This is a diagonal spread consisting of a long position in a deep ITM put option with a strike price K_1 and TTM T' , and a short position in an OTM put option with a strike price K_2 and shorter TTM $T < T'$. This is a net debit trade. The trader's outlook is bearish. At $t = T$ let V be the value of the long put option (expiring at $t = T'$) assuming $S_T = K$. We have:

$$P_{max} = V - D \quad (2.79)$$

$$L_{max} = D \quad (2.80)$$

If at the expiration of the short put option the stock price $K_2 \leq S_T \leq S_{stop-loss}$, where $S_{stop-loss}$ is the stop-loss price above which the trader would unwind the entire position, then the trader can write another OTM put option with TTM $T_1 < T'$. While maintaining the long position in the put option with TTM T' , the trader can generate income by periodically selling OTM put options with shorter maturities. In this regard, this strategy is similar to the calendar put spread. The main difference is that, in the diagonal put spread the deep ITM put option (unlike the close to ATM put option in the calendar put spread) more closely mimics the underlying stock, so the position is more protected against a sharp drop in the stock price.

2.22 Strategy: Long Straddle

This is a volatility strategy consisting of a long position in an ATM call option, and a long position in an ATM put option with a strike price K . This is a net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have¹⁴:

$$f_T = (S_T - K)^+ + (K - S_T)^+ - D \quad (2.81)$$

$$S_{*up} = K + D \quad (2.82)$$

$$S_{*down} = K - D \quad (2.83)$$

¹⁴For some literature on straddle/strangle strategies, see, e.g., Copeland and Galai (1983), Coval and Shumway (2001), Engle and Rosenberg (2000), Gao et al. (2017), Goltz and Lai (2009), Guo (2000), Hansch et al. (1998), Noh et al. (1994), Rusnáková and Šoltés (2012), Suresh (2015). Academic literature specifically on long/short guts strategies (which can be thought of as variations on straddles) appears to be more scarce. For a book reference, see, e.g., Cohen (2005). For covered straddles, see, e.g., Johnson (1979).

$$P_{max} = \text{unlimited} \quad (2.84)$$

$$L_{max} = D \quad (2.85)$$

2.23 Strategy: Long Strangle

This is a volatility strategy consisting of a long position in an OTM call option with a strike price K_1 , and a long position in an OTM put option with a strike price K_2 . This is a net debit trade. However, because both call and put options are OTM, this strategy is less costly to establish than a long straddle position. The flipside is that the movement in the stock price required to reach one of the break-even points is also more significant. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (S_T - K_1)^+ + (K_2 - S_T)^+ - D \quad (2.86)$$

$$S_{*up} = K_1 + D \quad (2.87)$$

$$S_{*down} = K_2 - D \quad (2.88)$$

$$P_{max} = \text{unlimited} \quad (2.89)$$

$$L_{max} = D \quad (2.90)$$

2.24 Strategy: Long Guts

This is a volatility strategy consisting of a long position in an ITM call option with a strike price K_1 , and a long position in an ITM put option with a strike price K_2 . This is a net debit trade. Since both call and put options are ITM, this strategy is more costly to establish than a long straddle position. The trader's outlook is neutral. This is a capital gain strategy. We have (assuming $D > K_2 - K_1$)¹⁵:

$$f_T = (S_T - K_1)^+ + (K_2 - S_T)^+ - D \quad (2.91)$$

$$S_{*up} = K_1 + D \quad (2.92)$$

$$S_{*down} = K_2 - D \quad (2.93)$$

$$P_{max} = \text{unlimited} \quad (2.94)$$

$$L_{max} = D - (K_2 - K_1) \quad (2.95)$$

¹⁵Otherwise this strategy would generate risk-free profits.

2.25 Strategy: Short Straddle

This is a sideways strategy consisting of a short position in an ATM call option, and a short position in an ATM put option with a strike price K . This is a net credit trade. The trader's outlook is neutral. This is an income strategy. We have:

$$f_T = -(S_T - K)^+ - (K - S_T)^+ + C \quad (2.96)$$

$$S_{*up} = K + C \quad (2.97)$$

$$S_{*down} = K - C \quad (2.98)$$

$$P_{max} = C \quad (2.99)$$

$$L_{max} = \text{unlimited} \quad (2.100)$$

2.26 Strategy: Short Strangle

This is a sideways strategy consisting of a short position in an OTM call option with a strike price K_1 , and a short position in an OTM put option with a strike price K_2 . This is a net credit trade. Since both call and put options are OTM, this strategy is less risky than a short straddle position. The flipside is that the initial credit is also lower. The trader's outlook is neutral. This is an income strategy. We have:

$$f_T = -(S_T - K_1)^+ - (K_2 - S_T)^+ + C \quad (2.101)$$

$$S_{*up} = K_1 + C \quad (2.102)$$

$$S_{*down} = K_2 - C \quad (2.103)$$

$$P_{max} = C \quad (2.104)$$

$$L_{max} = \text{unlimited} \quad (2.105)$$

2.27 Strategy: Short Guts

This is a sideways strategy consisting of a short position in an ITM call option with a strike price K_1 , and a short position in an ITM put option with a strike price K_2 . This is a net credit trade. Since both call and put options are ITM, the initial credit is higher than in a short straddle position. The flipside

is that the risk is also higher. The trader's outlook is neutral. This is an income strategy. We have¹⁶:

$$f_T = -(S_T - K_1)^+ - (K_2 - S_T)^+ + C \quad (2.106)$$

$$S_{*up} = K_1 + C \quad (2.107)$$

$$S_{*down} = K_2 - C \quad (2.108)$$

$$P_{max} = C - (K_2 - K_1) \quad (2.109)$$

$$L_{max} = \text{unlimited} \quad (2.110)$$

2.28 Strategy: Long Call Synthetic Straddle

This volatility strategy (which is the same as a long straddle with the put replaced by a synthetic put) amounts to shorting stock and buying *two* ATM (or the nearest ITM) call options with a strike price K . The trader's outlook is neutral. This is a capital gain strategy.¹⁷ We have (assuming $S_0 \geq K$ and $D > S_0 - K$):

$$f_T = S_0 - S_T + 2 \times (S_T - K)^+ - D \quad (2.111)$$

$$S_{*up} = 2 \times K - S_0 + D \quad (2.112)$$

$$S_{*down} = S_0 - D \quad (2.113)$$

$$P_{max} = \text{unlimited} \quad (2.114)$$

$$L_{max} = D - (S_0 - K) \quad (2.115)$$

2.29 Strategy: Long Put Synthetic Straddle

This volatility strategy (which is the same as a long straddle with the call replaced by a synthetic call) amounts to buying stock and buying *two* ATM (or the nearest ITM) put options with a strike price K . The trader's outlook is neutral. This is a capital gain strategy. We have (assuming $S_0 \leq K$ and $D > K - S_0$):

$$f_T = S_T - S_0 + 2 \times (K - S_T)^+ - D \quad (2.116)$$

$$S_{*up} = S_0 + D \quad (2.117)$$

$$S_{*down} = 2 \times K - S_0 - D \quad (2.118)$$

¹⁶Similarly to long guts, here we assume that $C > K_2 - K_1$.

¹⁷Academic literature on synthetic straddles appears to be scarce. See, e.g., Trifonov et al. (2011, 2014).

$$P_{max} = \text{unlimited} \quad (2.119)$$

$$L_{max} = D - (K - S_0) \quad (2.120)$$

2.30 Strategy: Short Call Synthetic Straddle

This sideways strategy (which is the same as a short straddle with the put replaced by a synthetic put) amounts to buying stock and selling *two* ATM (or the nearest OTM) call options with a strike price K . The trader's outlook is neutral. This is a capital gain strategy. We have (assuming $S_0 \leq K$):

$$f_T = S_T - S_0 - 2 \times (S_T - K)^+ + C \quad (2.121)$$

$$S_{*up} = 2 \times K - S_0 + C \quad (2.122)$$

$$S_{*down} = S_0 - C \quad (2.123)$$

$$P_{max} = K - S_0 + C \quad (2.124)$$

$$L_{max} = \text{unlimited} \quad (2.125)$$

2.31 Strategy: Short Put Synthetic Straddle

This sideways strategy (which is the same as a short straddle with the call replaced by a synthetic call) amounts to shorting stock and selling *two* ATM (or the nearest OTM) put options with a strike price K . The trader's outlook is neutral. This is a capital gain strategy. We have (assuming $S_0 \geq K$):

$$f_T = S_0 - S_T - 2 \times (K - S_T)^+ + C \quad (2.126)$$

$$S_{*up} = S_0 + C \quad (2.127)$$

$$S_{*down} = 2 \times K - S_0 - C \quad (2.128)$$

$$P_{max} = S_0 - K + C \quad (2.129)$$

$$L_{max} = \text{unlimited} \quad (2.130)$$

2.32 Strategy: Covered Short Straddle

This strategy amounts to augmenting a covered call by writing a put option with the same strike price K and TTM as the sold call option and thereby

increasing the income. The trader's outlook is bullish. We have:

$$f_T = S_T - S_0 - (S_T - K)^+ - (K - S_T)^+ + C \quad (2.131)$$

$$S_* = \frac{1}{2} (S_0 + K - C) \quad (2.132)$$

$$P_{max} = K - S_0 + C \quad (2.133)$$

$$L_{max} = S_0 + K - C \quad (2.134)$$

2.33 Strategy: Covered Short Strangle

This strategy amounts to augmenting a covered call by writing an OTM put option with a strike price K' and the same TTM as the sold call option (whose strike price is K) and thereby increasing the income. The trader's outlook is bullish. We have:

$$f_T = S_T - S_0 - (S_T - K)^+ - (K' - S_T)^+ + C \quad (2.135)$$

$$P_{max} = K - S_0 + C \quad (2.136)$$

$$L_{max} = S_0 + K' - C \quad (2.137)$$

2.34 Strategy: Strap

This is a volatility strategy consisting of a long position in *two* ATM call options, and a long position in an ATM put option with a strike price K . This is a net debit trade. The trader's outlook is bullish. This is a capital gain strategy. We have¹⁸:

$$f_T = 2 \times (S_T - K)^+ + (K - S_T)^+ - D \quad (2.138)$$

$$S_{*up} = K + \frac{D}{2} \quad (2.139)$$

$$S_{*down} = K - D \quad (2.140)$$

$$P_{max} = \text{unlimited} \quad (2.141)$$

$$L_{max} = D \quad (2.142)$$

¹⁸For some literature on strip and strap strategies, see, e.g., Jha and Kalimipal (2010), Topaloglou et al. (2011).

2.35 Strategy: Strip

This is a volatility strategy consisting of a long position in an ATM call option, and a long position in *two* ATM put options with a strike price K . This is a net debit trade. The trader's outlook is bearish. This is a capital gain strategy. We have:

$$f_T = (S_T - K)^+ + 2 \times (K - S_T)^+ - D \quad (2.143)$$

$$S_{*up} = K + D \quad (2.144)$$

$$S_{*down} = K - \frac{D}{2} \quad (2.145)$$

$$P_{max} = \text{unlimited} \quad (2.146)$$

$$L_{max} = D \quad (2.147)$$

2.36 Strategy: Call Ratio Backspread

This strategy consists of a short position in N_S close to ATM call options with a strike price K_1 , and a long position in N_L OTM call options with a strike price K_2 , where $N_L > N_S$. Typically, $N_L = 2$ and $N_S = 1$, or $N_L = 3$ and $N_S = 2$. The trader's outlook is strongly bullish. This is a capital gain strategy. We have¹⁹:

$$f_T = N_L \times (S_T - K_2)^+ - N_S \times (S_T - K_1)^+ - H \quad (2.148)$$

$$S_{*down} = K_1 - H/N_S, \quad H < 0 \quad (2.149)$$

$$S_{*up} = (N_L \times K_2 - N_S \times K_1 + H)/(N_L - N_S) \quad (2.150)$$

$$P_{max} = \text{unlimited} \quad (2.151)$$

$$L_{max} = N_S \times (K_2 - K_1) + H \quad (2.152)$$

2.37 Strategy: Put Ratio Backspread

This strategy consists of a short position in N_S close to ATM put options with a strike price K_1 , and a long position in N_L OTM put options with a strike price K_2 , where $N_L > N_S$. Typically, $N_L = 2$ and $N_S = 1$, or $N_L = 3$ and

¹⁹For some literature on call/put ratio (back)spreads, see, e.g., Augustin et al. (2015), Chaput and Ederington (2008), Šoltés (2010), Šoltés and Amaitiek (2010b), Šoltés and Rusnáková (2013).

$N_S = 2$. The trader's outlook is strongly bearish. This is a capital gain strategy. We have:

$$f_T = N_L \times (K_2 - S_T)^+ - N_S \times (K_1 - S_T)^+ - H \quad (2.153)$$

$$S_{*up} = K_1 + H/N_S, \quad H < 0 \quad (2.154)$$

$$S_{*down} = (N_L \times K_2 - N_S \times K_1 - H)/(N_L - N_S) \quad (2.155)$$

$$P_{max} = N_L \times K_2 - N_S \times K_1 - H \quad (2.156)$$

$$L_{max} = N_S \times (K_1 - K_2) + H \quad (2.157)$$

2.38 Strategy: Ratio Call Spread

This strategy consists of a short position in N_S close to ATM call options with a strike price K_1 , and a long position in N_L ITM call options with a strike price K_2 , where $N_L < N_S$. Typically, $N_L = 1$ and $N_S = 2$, or $N_L = 2$ and $N_S = 3$. This is an income strategy if it is structured as a net credit trade. The trader's outlook is neutral to bearish. We have²⁰:

$$f_T = N_L \times (S_T - K_2)^+ - N_S \times (S_T - K_1)^+ - H \quad (2.158)$$

$$S_{*down} = K_2 + H/N_L, \quad H > 0 \quad (2.159)$$

$$S_{*up} = (N_S \times K_1 - N_L \times K_2 - H)/(N_S - N_L) \quad (2.160)$$

$$P_{max} = N_L \times (K_1 - K_2) - H \quad (2.161)$$

$$L_{max} = \text{unlimited} \quad (2.162)$$

2.39 Strategy: Ratio Put Spread

This strategy consists of a short position in N_S close to ATM put options with a strike price K_1 , and a long position in N_L ITM put options with a strike price K_2 , where $N_L < N_S$. Typically, $N_L = 1$ and $N_S = 2$, or $N_L = 2$ and $N_S = 3$. This is an income strategy if it is structured as a net credit trade. The trader's outlook is neutral to bullish. We have:

$$f_T = N_L \times (K_2 - S_T)^+ - N_S \times (K_1 - S_T)^+ - H \quad (2.163)$$

$$S_{*up} = K_2 - H/N_L, \quad H > 0 \quad (2.164)$$

$$S_{*down} = (N_S \times K_1 - N_L \times K_2 + H)/(N_S - N_L) \quad (2.165)$$

²⁰So, the difference between call/put ratio backspreads and ratio call/put spreads is that in the former $N_L > N_S$, while in the latter $N_L < N_S$.

$$P_{max} = N_L \times (K_2 - K_1) - H \quad (2.166)$$

$$L_{max} = N_S \times K_1 - N_L \times K_2 + H \quad (2.167)$$

2.40 Strategy: Long Call Butterfly

This is a sideways strategy consisting of a long position in an OTM call option with a strike price K_1 , a short position in *two* ATM call options with a strike price K_2 , and a long position in an ITM call option with a strike price K_3 . The strikes are equidistant: $K_2 - K_3 = K_1 - K_2 = \kappa$. This is a relatively low cost net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have²¹:

$$f_T = (S_T - K_1)^+ + (S_T - K_3)^+ - 2 \times (S_T - K_2)^+ - D \quad (2.168)$$

$$S_{*down} = K_3 + D \quad (2.169)$$

$$S_{*up} = K_1 - D \quad (2.170)$$

$$P_{max} = \kappa - D \quad (2.171)$$

$$L_{max} = D \quad (2.172)$$

Strategy: Modified Call Butterfly

This is a variation of the long call butterfly strategy where the strikes are no longer equidistant; instead we have $K_1 - K_2 < K_2 - K_3$. This results in a sideways strategy with a bullish bias. We have:

$$f_T = (S_T - K_1)^+ + (S_T - K_3)^+ - 2 \times (S_T - K_2)^+ - D \quad (2.173)$$

$$S_* = K_3 + D \quad (2.174)$$

$$P_{max} = K_2 - K_3 - D \quad (2.175)$$

$$L_{max} = D \quad (2.176)$$

²¹For some literature on butterfly spreads (including iron butterflies), see, e.g., Balbás et al. (1999), Howison et al. (2013), Jongadsayakul (2017), Matsypura and Timkovsky (2010), Youbi et al. (2017), Wolf (2014), Wystup (2017). Academic literature on condor strategies (which can be thought of as variations on butterflies) appears to be more scarce. See, e.g., Niblock (2017).

2.41 Strategy: Long Put Butterfly

This is a sideways strategy consisting of a long position in an OTM put option with a strike price K_1 , a short position in *two* ATM put options with a strike price K_2 , and a long position in an ITM put option with a strike price K_3 . The strikes are equidistant: $K_3 - K_2 = K_2 - K_1 = \kappa$. This is a relatively low cost net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (K_1 - S_T)^+ + (K_3 - S_T)^+ - 2 \times (K_2 - S_T)^+ - D \quad (2.177)$$

$$S_{*up} = K_3 - D \quad (2.178)$$

$$S_{*down} = K_1 + D \quad (2.179)$$

$$P_{max} = \kappa - D \quad (2.180)$$

$$L_{max} = D \quad (2.181)$$

Strategy: Modified Put Butterfly

This is a variation of the long put butterfly strategy where the strikes are no longer equidistant; instead we have $K_3 - K_2 < K_2 - K_1$. This results in a sideways strategy with a bullish bias. We have (for $H > 0$ there is also $S_{*up} = K_3 - H$)²²:

$$f_T = (K_1 - S_T)^+ + (K_3 - S_T)^+ - 2 \times (K_2 - S_T)^+ - H \quad (2.182)$$

$$S_{*down} = 2 \times K_2 - K_3 + H \quad (2.183)$$

$$P_{max} = K_3 - K_2 - H \quad (2.184)$$

$$L_{max} = 2 \times K_2 - K_1 - K_3 + H \quad (2.185)$$

2.42 Strategy: Short Call Butterfly

This is a volatility strategy consisting of a short position in an ITM call option with a strike price K_1 , a long position in *two* ATM call options with a strike price K_2 , and a short position in an OTM call option with a strike price K_3 . The strikes are equidistant: $K_3 - K_2 = K_2 - K_1 = \kappa$. This is a net credit trade. In this sense, this is an income strategy. However, the potential reward

²²Ideally, this should be structured as a net credit trade, albeit this may not always be possible.

is sizably smaller than with a short straddle or a short strangle (albeit with a lower risk). The trader's outlook is neutral. We have:

$$f_T = 2 \times (S_T - K_2)^+ - (S_T - K_1)^+ - (S_T - K_3)^+ + C \quad (2.186)$$

$$S_{*up} = K_3 - C \quad (2.187)$$

$$S_{*down} = K_1 + C \quad (2.188)$$

$$P_{max} = C \quad (2.189)$$

$$L_{max} = \kappa - C \quad (2.190)$$

2.43 Strategy: Short Put Butterfly

This is a volatility strategy consisting of a short position in an ITM put option with a strike price K_1 , a long position in *two* ATM put options with a strike price K_2 , and a short position in an OTM put option with a strike price K_3 . The strikes are equidistant: $K_2 - K_3 = K_1 - K_2 = \kappa$. This is a net credit trade. In this sense, this is an income strategy. However, the potential reward is sizably smaller than with a short straddle or a short strangle (albeit with a lower risk). The trader's outlook is neutral. We have:

$$f_T = 2 \times (K_2 - S_T)^+ - (K_1 - S_T)^+ - (K_3 - S_T)^+ + C \quad (2.191)$$

$$S_{*down} = K_3 + C \quad (2.192)$$

$$S_{*up} = K_1 - C \quad (2.193)$$

$$P_{max} = C \quad (2.194)$$

$$L_{max} = \kappa - C \quad (2.195)$$

2.44 Strategy: "Long" Iron Butterfly

This sideways strategy is a combination of a bull put spread and a bear call spread and consists of a long position in an OTM put option with a strike price K_1 , a short position in an ATM put option and an ATM call option with a strike price K_2 , and a long position in an OTM call option with a strike price K_3 . The strikes are equidistant: $K_2 - K_1 = K_3 - K_2 = \kappa$. This is a net credit trade. The trader's outlook is neutral. This is an income strategy. We have:

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ - (S_T - K_2)^+ + (S_T - K_3)^+ + C \quad (2.196)$$

$$S_{*up} = K_2 + C \quad (2.197)$$

$$S_{*down} = K_2 - C \quad (2.198)$$

$$P_{max} = C \quad (2.199)$$

$$L_{max} = \kappa - C \quad (2.200)$$

2.45 Strategy: "Short" Iron Butterfly

This volatility strategy is a combination of a bear put spread and a bull call spread and consists of a short position in an OTM put option with a strike price K_1 , a long position in an ATM put option and an ATM call option with a strike price K_2 , and a short position in an OTM call option with a strike price K_3 . The strikes are equidistant: $K_2 - K_1 = K_3 - K_2 = \kappa$. This is a net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (K_2 - S_T)^+ + (S_T - K_2)^+ - (K_1 - S_T)^+ - (S_T - K_3)^+ - D \quad (2.201)$$

$$S_{*up} = K_2 + D \quad (2.202)$$

$$S_{*down} = K_2 - D \quad (2.203)$$

$$P_{max} = \kappa - D \quad (2.204)$$

$$L_{max} = D \quad (2.205)$$

2.46 Strategy: Long Call Condor

This is a sideways strategy consisting of a long position in an ITM call option with a strike price K_1 , a short position in an ITM call option with a higher strike price K_2 , a short position in an OTM call option with a strike price K_3 , and a long position in an OTM call option with a higher strike price K_4 . All strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a relatively low cost net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (S_T - K_1)^+ - (S_T - K_2)^+ - (S_T - K_3)^+ + (S_T - K_4)^+ - D \quad (2.206)$$

$$S_{*up} = K_4 - D \quad (2.207)$$

$$S_{*down} = K_1 + D \quad (2.208)$$

$$P_{max} = \kappa - D \quad (2.209)$$

$$L_{max} = D \quad (2.210)$$

2.47 Strategy: Long Put Condor

This is a sideways strategy consisting of a long position in an OTM put option with a strike price K_1 , a short position in an OTM put option with a higher strike price K_2 , a short position in an ITM put option with a strike price K_3 , and a long position in an ITM put option with a higher strike price K_4 . All strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a relatively low cost net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ - (K_3 - S_T)^+ + (K_4 - S_T)^+ - D \quad (2.211)$$

$$S_{*up} = K_4 - D \quad (2.212)$$

$$S_{*down} = K_1 + D \quad (2.213)$$

$$P_{max} = \kappa - D \quad (2.214)$$

$$L_{max} = D \quad (2.215)$$

2.48 Strategy: Short Call Condor

This is a volatility strategy consisting of a short position in an ITM call option with a strike price K_1 , a long position in an ITM call option with a higher strike price K_2 , a long position in an OTM call option with a strike price K_3 , and a short position in an OTM call option with a higher strike price K_4 . All strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a relatively low net credit trade. As with a short call butterfly, the potential reward is sizably smaller than with a short straddle or a short strangle (albeit with a lower risk). So, this is a capital gain (rather than an income) strategy. The trader's outlook is neutral. We have:

$$f_T = (S_T - K_2)^+ + (S_T - K_3)^+ - (S_T - K_1)^+ - (S_T - K_4)^+ + C \quad (2.216)$$

$$S_{*up} = K_4 - C \quad (2.217)$$

$$S_{*down} = K_1 + C \quad (2.218)$$

$$P_{max} = C \quad (2.219)$$

$$L_{max} = \kappa - C \quad (2.220)$$

2.49 Strategy: Short Put Condor

This is a volatility strategy consisting of a short position in an OTM put option with a strike price K_1 , a long position in an OTM put option with a higher strike price K_2 , a long position in an ITM put option with a strike price K_3 , and a short position in an ITM put option with a higher strike price K_4 . All

strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a relatively low net credit trade. As with a short put butterfly, the potential reward is sizably smaller than with a short straddle or a short strangle (albeit with a lower risk). So, this is a capital gain (rather than an income) strategy. The trader's outlook is neutral. We have:

$$f_T = (K_2 - S_T)^+ + (K_3 - S_T)^+ - (K_1 - S_T)^+ - (K_4 - S_T)^+ + C \quad (2.221)$$

$$S_{*up} = K_4 - C \quad (2.222)$$

$$S_{*down} = K_1 + C \quad (2.223)$$

$$P_{max} = C \quad (2.224)$$

$$L_{max} = \kappa - C \quad (2.225)$$

2.50 Strategy: Long Iron Condor

This sideways strategy is a combination of a bull put spread and a bear call spread and consists of a long position in an OTM put option with a strike price K_1 , a short position in an OTM put option with a higher strike price K_2 , a short position in an OTM call option with a strike price K_3 , and a long position in an OTM call option with a higher strike price K_4 . The strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a net credit trade. The trader's outlook is neutral. This is an income strategy. We have:

$$f_T = (K_1 - S_T)^+ + (S_T - K_4)^+ - (K_2 - S_T)^+ - (S_T - K_3)^+ + C \quad (2.226)$$

$$S_{*up} = K_3 + C \quad (2.227)$$

$$S_{*down} = K_2 - C \quad (2.228)$$

$$P_{max} = C \quad (2.229)$$

$$L_{max} = \kappa - C \quad (2.230)$$

2.51 Strategy: Short Iron Condor

This volatility strategy is a combination of a bear put spread and a bull call spread and consists of a short position in an OTM put option with a strike price K_1 , a long position in an OTM put option with a higher strike price K_2 , a long position in an OTM call option with a strike price K_3 , and a short position in an OTM call option with a higher strike price K_4 . The strikes are equidistant: $K_4 - K_3 = K_3 - K_2 = K_2 - K_1 = \kappa$. This is a net debit trade. The trader's outlook is neutral. This is a capital gain strategy. We have:

$$f_T = (K_2 - S_T)^+ + (S_T - K_3)^+ - (K_1 - S_T)^+ - (S_T - K_4)^+ - D \quad (2.231)$$

$$S_{*up} = K_3 + D \quad (2.232)$$

$$S_{*down} = K_2 - D \quad (2.233)$$

$$P_{max} = \kappa - D \quad (2.234)$$

$$L_{max} = D \quad (2.235)$$

2.52 Strategy: Long Box

This volatility strategy can be viewed as a combination of a long synthetic forward and a short synthetic forward, or as a combination of a bull call spread and a bear put spread, and consists of a long position in an ITM put option with a strike price K_1 , a short position in an OTM put option with a lower strike price K_2 , a long position in an ITM call option with the strike price K_2 , and a short position in an OTM call option with the strike price K_1 . The trader's outlook is neutral. This is a capital gain strategy.²³ We have (assuming $K_1 \geq K_2 + D$):

$$\begin{aligned} f_T &= (K_1 - S_T)^+ - (K_2 - S_T)^+ + (S_T - K_2)^+ - (S_T - K_1)^+ - D \\ &= K_1 - K_2 - D \end{aligned} \quad (2.236)$$

$$P_{max} = (K_1 - K_2) - D \quad (2.237)$$

2.53 Strategy: Collar

This strategy (a.k.a. “fence”) is a covered call augmented by a long put option as insurance against the stock price falling.²⁴ It amounts to buying stock, buying an OTM put option with a strike price K_1 , and selling an OTM call option with a higher strike price K_2 . The trader's outlook is moderately bullish. This is a capital gain strategy. We have²⁵:

$$f_T = S_T - S_0 + (K_1 - S_T)^+ - (S_T - K_2)^+ - H \quad (2.238)$$

$$S_* = S_0 + H \quad (2.239)$$

²³In some cases it can be used as a tax strategy—see, e.g., Cohen (2005). For some literature on box option strategies, see, e.g., BenZion et al. (2005), Bharadwaj and Wiggins (2001), Billingsley and Chance (1985), Clarke et al. (2013), Fung et al. (2004), Hemler and Miller (1997), Jongadsayakul (2016), Ronn and Ronn (1989), Vipul (2009).

²⁴Similarly, a short collar is a covered put augmented by a long call option.

²⁵For some literature on collar strategies, see, e.g., Bartonová (2012), Burnside et al. (2011), D'Antonio (2008), Israelov and Klein (2016), Li and Yang (2017), Officer (2004, 2006), Shan et al. (2010), Szado and Schneeweis (2010, 2011), Timmermans et al. (2017), Yim et al. (2011).

$$P_{max} = K_2 - S_0 - H \quad (2.240)$$

$$L_{max} = S_0 - K_1 + H \quad (2.241)$$

2.54 Strategy: Bullish Short Seagull Spread

This option trading strategy is a bull call spread financed with a sale of an OTM put option. It amounts to a short position in an OTM put option with a strike price K_1 , a long position in an ATM call option with a strike price K_2 , and a short position in an OTM call option with a strike price K_3 . Ideally, the trade should be structured to have zero cost. The trader's outlook is bullish. This is a capital gain strategy. We have²⁶:

$$f_T = -(K_1 - S_T)^+ + (S_T - K_2)^+ - (S_T - K_3)^+ - H \quad (2.242)$$

$$S_* = K_2 + H, \quad H > 0 \quad (2.243)$$

$$S_* = K_1 + H, \quad H < 0 \quad (2.244)$$

$$K_1 \leq S_* \leq K_2, \quad H = 0 \quad (2.245)$$

$$P_{max} = K_3 - K_2 - H \quad (2.246)$$

$$L_{max} = K_1 + H \quad (2.247)$$

2.55 Strategy: Bearish Long Seagull Spread

This option trading strategy is a short combo (short risk reversal) hedged against the stock price rising by buying an OTM call option. It amounts to a long position in an OTM put option with a strike price K_1 , a short position in an ATM call option with a strike price K_2 , and a long position in an OTM call option with a strike price K_3 . Ideally, the trade should be structured to have zero cost. The trader's outlook is bearish. This is a capital gain strategy. We have:

$$f_T = (K_1 - S_T)^+ - (S_T - K_2)^+ + (S_T - K_3)^+ - H \quad (2.248)$$

$$S_* = K_1 - H, \quad H > 0 \quad (2.249)$$

$$S_* = K_2 - H, \quad H < 0 \quad (2.250)$$

$$K_1 \leq S_* \leq K_2, \quad H = 0 \quad (2.251)$$

²⁶Academic literature on seagull spreads appears to be scarce. For a book reference, see, e.g., Wystup (2017).

$$P_{max} = K_1 - H \quad (2.252)$$

$$L_{max} = K_3 - K_2 + H \quad (2.253)$$

2.56 Strategy: Bearish Short Seagull Spread

This option trading strategy is a bear put spread financed with a sale of an OTM call option. It amounts to a short position in an OTM put option with a strike price K_1 , a long position in an ATM put option with a strike price K_2 , and a short position in an OTM call option with a strike price K_3 . Ideally, the trade should be structured to have zero cost. The trader's outlook is bearish. This is a capital gain strategy. We have:

$$f_T = -(K_1 - S_T)^+ + (K_2 - S_T)^+ - (S_T - K_3)^+ - H \quad (2.254)$$

$$S_* = K_2 - H, \quad H > 0 \quad (2.255)$$

$$S_* = K_3 - H, \quad H < 0 \quad (2.256)$$

$$K_2 \leq S_* \leq K_3, \quad H = 0 \quad (2.257)$$

$$P_{max} = K_2 - K_1 - H \quad (2.258)$$

$$L_{max} = \text{unlimited} \quad (2.259)$$

2.57 Strategy: Bullish Long Seagull Spread

This option trading strategy is a long combo (long risk reversal) hedged against the stock price falling by buying an OTM put option. It amounts to a long position in an OTM put option with a strike price K_1 , a short position in an ATM put option with a strike price K_2 , and a long position in an OTM call option with a strike price K_3 . Ideally, the trade should be structured to have zero cost. The trader's outlook is bullish. This is a capital gain strategy. We have:

$$f_T = (K_1 - S_T)^+ - (K_2 - S_T)^+ + (S_T - K_3)^+ - H \quad (2.260)$$

$$S_* = K_3 + H, \quad H > 0 \quad (2.261)$$

$$S_* = K_2 + H, \quad H < 0 \quad (2.262)$$

$$K_2 \leq S_* \leq K_3, \quad H = 0 \quad (2.263)$$

$$P_{max} = \text{unlimited} \quad (2.264)$$

$$L_{max} = K_2 - K_1 + H \quad (2.265)$$

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3

Stocks

3.1 Strategy: Price-Momentum

Empirically, there appears to be certain “inertia” in stock returns known as the momentum effect, whereby future returns are positively correlated with past returns (see, e.g., Asness 1994; Asness et al. 2013, 2014; Grinblatt and Moskowitz 2004; Jegadeesh and Titman 1993). Let t denote time measured in the units of 1 month, with $t = 0$ corresponding to the most recent time. Let $P_i(t)$ be the time series of prices (fully adjusted for splits and dividends) for the stock labeled by i ($i = 1, \dots, N$, where N is the number of stocks in the trading universe). Let

$$R_i(t) = \frac{P_i(t)}{P_i(t+1)} - 1 \quad (3.1)$$

$$R_i^{cum} = \frac{P_i(S)}{P_i(S+T)} - 1 \quad (3.2)$$

$$R_i^{mean} = \frac{1}{T} \sum_{t=S}^{S+T-1} R_i(t) \quad (3.3)$$

$$R_i^{risk.adj} = \frac{R_i^{mean}}{\sigma_i} \quad (3.4)$$

$$\sigma_i^2 = \frac{1}{T-1} \sum_{t=S}^{S+T-1} (R_i(t) - R_i^{mean})^2 \quad (3.5)$$

Here: $R_i(t)$ is the monthly return; R_i^{cum} is the cumulative return computed over the T -month “formation period” (usually $T = 12$) skipping the most recent S -month “skip period” (usually $S = 1$)¹; R_i^{mean} is the mean monthly return computed over the formation period; $R_i^{risk.adj}$ is the risk-adjusted mean return over the formation period; and σ_i is the monthly volatility calculated over the formation period.

The price-momentum strategy amounts to buying the best performing stocks and selling the worst performing stocks, where the “performance” is measured by a selection criterion based on R_i^{cum} , R_i^{mean} , $R_i^{risk.adj}$ or some other criterion. E.g., after the stocks are sorted by R_i^{cum} (in the decreasing order), the trader can, e.g., buy stocks in the top decile (winners) and short stocks in the bottom decile (losers).² This can be a zero-cost strategy, i.e., the corresponding portfolio is dollar-neutral. Alternatively, a long-only portfolio can be constructed by buying stocks in, e.g., the top decile. Once a portfolio is established at $t = 0$, it is kept unaltered during a predefined “holding period”,³ which can be 1 month or longer (longer holding period portfolios typically have diminishing returns before trading costs as the momentum effect fades with time). Multi-month-holding portfolios can be constructed by overlapping 1-month-holding portfolios (see, e.g., Jegadeesh and Titman 1993).

The above prescription does not fix the relative weights w_i of the stocks in the portfolio. For a long-only portfolio we have $w_i \geq 0$ and

$$\sum_{i=1}^N w_i = 1 \quad (3.6)$$

So, if the total investment level is I , then the stock labeled by i has $I \times w_i$ dollars invested in it. This, up to rounding, translates into $Q_i = I \times w_i / P_i(0)$ shares.⁴ One can simply take uniform weights, $w_i = 1/N$ for all stocks, albeit other weighting schemes are possible. E.g., we can have nonuniform $w_i \propto 1/\sigma_i$, or $w_i \propto 1/\sigma_i^2$, etc.

¹Usually, the most recent month is skipped due to an empirically observed mean-reversion (a.k.a. contrarian) effect in monthly returns possibly rooted in liquidity/microstructure issues—see, e.g., Asness (1994), Boudoukh et al. (1994), Grinblatt and Moskowitz (2004), Jegadeesh (1990), Lo and MacKinlay (1990).

²There is some degree of arbitrariness in defining winners and losers.

³Albeit, e.g., a long-only portfolio may have to be liquidated before the end of this holding period due to unforeseen events, such as market crashes.

⁴That is, assuming the stock is bought at the price $P_i(0)$, which does not account for slippage.

For a dollar-neutral portfolio we can have negative w_i and

$$\sum_{i=1}^N |w_i| = 1 \quad (3.7)$$

$$\sum_{i=1}^N w_i = 0 \quad (3.8)$$

So, if the total investment level is $I = I_L + I_S$, where I_L is the total long investment, and I_S is the absolute value of the total short investment,⁵ then the stock labeled by i has $I \times w_i$ dollars invested in it, where $w_i > 0$ for long stocks, and $w_i < 0$ for short stocks. One can simply take modulus-uniform weights, where $w_i = 1/2N_L$ for all N_L long stocks, and $w_i = -1/2N_S$ for all N_S short stocks. However, other weighting schemes are possible, e.g., as above, weights suppressed by σ_i , σ_i^2 , etc.⁶

3.2 Strategy: Earnings-Momentum

This strategy amounts to buying winners and selling losers as in the price-momentum strategy, but the selection criterion is based on earnings. One way to define such a selection criterion is via standardized unexpected earnings (SUE) (Chan et al. 1996)⁷:

$$\text{SUE}_i = \frac{E_i - E'_i}{\sigma_i} \quad (3.9)$$

Here: E_i is the most recently announced quarterly earnings per share of the stock labeled by i ; E'_i is the earnings per share announced 4 quarters ago;

⁵For dollar-neutral portfolios $I_L = I_S$ and $I = 2 \times I_L$.

⁶For some additional literature on momentum strategies, see, e.g., Antonacci (2017), Asem and Tian (2010), Barroso and Santa-Clara (2014), Bhojraj and Swaminathan (2006), Chordia and Shivakumar (2002), Chuang and Ho (2014), Cooper et al. (2004), Daniel and Moskowitz (2016), Géczy and Samonov (2016), Griffin et al. (2003), Grundy and Martin (2001), Hwang and George (2004), Jegadeesh and Titman (2001), Karolyi and Kho (2004), Korajczyk and Sadka (2004), Liu and Zhang (2008), Moskowitz and Grinblatt (1999), Rouwenhorst (1998), Sadka (2002), Siganos and Chelley-Steeley (2006), Stivers and Sun (2010).

⁷Also see, e.g., Bartov et al. (2005), Battalio and Mendenhall (2007), Bernard and Thomas (1989), Bernard and Thomas (1990), Bhushan (1994), Chordia et al. (2009), Chordia and Shivakumar (2006), Czajka et al. (2013), Doyle et al. (2006), Foster et al. (1984), Hew et al. (1996), Hirshleifer et al. (2009), Jansen and Nikiforov (2016), Livnat and Mendenhall (2006), Loh and Warachka (2012), Mendenhall (2004), Ng et al. (2008), Rendleman et al. (1982), Stickel (1991), Watts (1978).

σ_i is the standard deviation of the unexpected earnings $E_i - E'_i$ over the last 8 quarters. Similarly to the price-momentum strategy, the trader can, e.g., construct a dollar-neutral portfolio by buying stocks in the top decile by SUE, and shorting stocks in the bottom decile.⁸

3.3 Strategy: Value

This strategy amounts to buying winners and selling losers as in the price-momentum and earnings-momentum strategies, but the selection criterion is based on value. Value can be defined as the Book-to-Price (B/P) ratio (see, e.g., Rosenberg et al. 1985). Here “Book” is the company’s book value *per share outstanding* (so the B/P ratio is the same as the Book-to-Market ratio, where now “Book” stands for its total book value, *not* per share outstanding, and “Market” is its market capitalization). The trader can, e.g., construct a zero-cost portfolio by buying stocks in the top decile by the B/P ratio, and shorting stocks in the bottom decile. There can be variations in the definition of the B/P ratio. Thus, e.g., Asness et al. (2013) uses current (i.e., most up-to-date) prices, while Fama and French (1992) and some others use prices contemporaneous with the book value.⁹

3.4 Strategy: Low-Volatility Anomaly

This strategy is based on the empirical observation that future returns of previously low-return-volatility portfolios outperform those of previously high-return-volatility portfolios,¹⁰ which goes counter to the “naïve” expectation that higher risk assets should yield proportionately higher returns. Thus, if σ_i is defined as the historical volatility (computed over a time series of historical returns, as in Eq. (3.5)), the trader can, e.g., construct a dollar-neutral portfolio by buying stocks in the bottom decile by σ_i (low-volatility stocks), and shorting stocks in the top decile (high-volatility stocks). The length of the sample used for computing the historical volatility can, e.g., be 6 months

⁸Typically, the holding period is 6 months, with diminishing returns for longer holding periods.

⁹The holding period typically is 1–6 months. For some additional literature on value strategies, see, e.g., Erb and Harvey (2006), Fama and French (1993, 1996, 1998, 2012), Fisher et al. (2016), Gerakos and Linnainmaa (2012), Novy-Marx (2013), Piotroski (2000), Piotroski and So (2012), Stattman (1980), Suhonen et al. (2017), Zhang (2005).

¹⁰See, e.g., Ang et al. (2006, 2009), Baker et al. (2011), Black (1972), Blitz and van Vliet (2007), Clarke et al. (2006, 2010), Frazzini and Pedersen (2014), Fu (2009), Garcia-Feijóo et al. (2015), Li et al. (2014, 2016), Merton (1987).

(126 trading days) to a year (252 trading days), with a similar duration for the holding period (with no “skip period” required).

3.5 Strategy: Implied Volatility

This strategy is based on the empirical observation that stocks with larger increases in call implied volatilities over the previous month on average have higher future returns, while stocks with larger increases in put implied volatilities over the previous month on average have lower future returns (see, e.g., An et al. 2014; Chen et al. 2016).¹¹ Therefore, the trader can, e.g., construct a dollar-neutral portfolio by buying stocks in the top decile by the increase in call implied volatilities, and shorting stocks in the top decile by the increase in put implied volatilities. One can also consider variations, e.g., buying stocks in the top decile by the *difference* twixt the change in call implied volatilities and the change in put implied volatilities.

3.6 Strategy: Multifactor Portfolio

This strategy amounts to buying and shorting stocks based on multiple factors such as value, momentum, etc. For instance, usually value and momentum are negatively correlated and combining them can add value (see, e.g., Asness et al. 2013). There is a variety of ways in which $F > 1$ factors can be combined.¹² The simplest way is to diversify the exposure to the F factors with some weights w_A , where $A = 1, \dots, F$ labels the factors. That is, if I is the total investment level, then the F portfolios (each built as above based on the corresponding factor) are allocated the investment levels $I_A = w_A \times I$, where (assuming all $w_A > 0$)

$$\sum_{A=1}^F w_A = 1 \quad (3.10)$$

Thus, one can simply take uniform weights $w_A = 1/F$, albeit this may not be the most optimal weighting scheme. E.g., similarly to Sect. 3.1, there are weighting schemes with $w_A \propto 1/\sigma_A$, $w_A \propto 1/\sigma_A^2$, etc., where σ_A is the

¹¹Also see, e.g., Bali and Hovakimian (2009), Bollen and Whaley (2004), Busch et al. (2011), Chakravarty et al. (2004), Conrad et al. (2013), Cremers and Weinbaum (2010), Pan and Poteshman (2006), Xing et al. (2010).

¹²And the holding period depends on which factors are combined.

historical volatility for the corresponding factor portfolio (uniformly normalized, e.g., per dollar invested).¹³

Alternatively, consider F rankings of stocks based on the F factors. One can now combine these rankings in various ways to blend the factors. E.g., in the case of two factors, momentum and value, one can take the top (winners) and bottom (losers) quintiles by momentum and further split them into top half and bottom half, respectively, by value. Or one can take the top and bottom quintiles by value and split them by momentum.¹⁴ Yet another way is to define demeaned ranks

$$s_{Ai} = \text{rank}(f_{Ai}) - \frac{1}{N} \sum_{j=1}^N \text{rank}(f_{Aj}) \quad (3.11)$$

where f_{Ai} is the numeric value of the factor labeled by A (e.g., momentum) for the stock labeled by i ($i = 1, \dots, N$). One can then simply average the ranks:

$$s_i = \frac{1}{F} \sum_{A=1}^F s_{Ai} \quad (3.12)$$

The combined “score” s_i can have ties, which, if need be (e.g., if there is an ambiguity at the border of the top decile) can be resolved, e.g., simply by giving preference to one of the factor rankings. Averaging over s_{Ai} simply minimizes the sum of squares of the Euclidean distances between the N -vector s_i and the K N -vectors s_{Ai} . One can introduce nonuniform weights into this sum (which would amount to a weighted average in Eq. (3.12)), or even use a different definition of the distance (e.g., the Manhattan distance), which would complicate the problem computationally. Etc.¹⁵

3.7 Strategy: Residual Momentum

This is the same as the price-momentum strategy with the stock returns $R_i(t)$ replaced by the residuals $\epsilon_i(t)$ of a *serial* regression of the stock returns $R_i(t)$

¹³Another approach is to fix the weights w_A by optimizing a portfolio of the F expected returns corresponding to the F factors (using an invertible $F \times F$ covariance matrix for these returns).

¹⁴These two ways generally do not produce the same resultant portfolios.

¹⁵For additional literature on multifactor strategies, see, e.g., Amenc et al. (2015, 2016), Arnott et al. (2013), Asness (1997), Barber et al. (2015), Cochrane (1999), Fama (1996), Grinold and Kahn (2000), Hsu et al. (2018), Kahn and Lemmon (2015, 2016), Kozlov and Petajisto (2013), Malkiel (2014), Wang (2005).

over, e.g., the 3 Fama-French factors $MKT(t)$, $SMB(t)$, $HML(t)$,¹⁶ with the intercept (see, e.g., Blitz et al. 2011)¹⁷:

$$R_i(t) = \alpha_i + \beta_{1,i} MKT(t) + \beta_{2,i} SMB(t) + \beta_{3,i} HML(t) + \epsilon_i(t) \quad (3.13)$$

The regression is run over a 36-month period (Blitz et al. 2011) (with the 1-month skip period) to estimate the regression coefficients α_i , $\beta_{1,i}$, $\beta_{2,i}$, $\beta_{3,i}$. Once the coefficients are estimated, the residuals can be computed for the 12-month formation period (again, with the 1-month skip period):

$$\epsilon_i(t) = R_i(t) - \beta_{1,i} MKT(t) - \beta_{2,i} SMB(t) - \beta_{3,i} HML(t) \quad (3.14)$$

Note that α_i is not included in this computation of the residuals for the 12-month formation period as α_i was computed for the 36-month period. These residuals $\epsilon_i(t)$ are then used to compute, e.g., the risk-adjusted residual returns $\tilde{R}_i^{risk.adj}$ (here $S = 1$ and $T = 12$; the holding period typically is 1 month, but can be longer):

$$\epsilon_i^{mean} = \frac{1}{T} \sum_{t=S}^{S+T-1} \epsilon_i(t) \quad (3.15)$$

$$\tilde{R}_i^{risk.adj} = \frac{\epsilon_i^{mean}}{\tilde{\sigma}_i} \quad (3.16)$$

$$\tilde{\sigma}_i^2 = \frac{1}{T-1} \sum_{t=S}^{S+T-1} (\epsilon_i(t) - \epsilon_i^{mean})^2 \quad (3.17)$$

E.g., a dollar-neutral portfolio can be constructed by buying stocks in the top decile by $\tilde{R}_i^{risk.adj}$, and shorting stocks in the bottom decile (with (non)uniform weights).

¹⁶The stock returns R_i are defined in excess of the risk-free rate (the one-month Treasury bill rate); MKT is the excess return of the market portfolio; SMB is the excess return of the Small minus Big (by market capitalization) portfolio; HML is the excess return of the High minus Low (by book-to-market) portfolio. See, e.g., Carhart (1997), Fama and French (1993) for details.

¹⁷For some additional literature related to the residual momentum strategy, see, e.g., Blitz et al. (2013), Chang et al. (2016), Chaves (2012), Chuang (2015), Grundy and Martin (2001), Gutierrez and Prinsky (2007), Hühn and Scholz (2017), Huij and Lansdorp (2017), Van Oord (2016).

3.8 Strategy: Pairs Trading

This dollar-neutral strategy amounts to identifying a pair of historically highly correlated stocks (call them stock A and stock B) and, when a mispricing (i.e., a deviation from the high historical correlation) occurs, shorting the “rich” stock and buying the “cheap” stock. This is an example of a mean-reversion strategy. Let $P_A(t_1)$ and $P_B(t_1)$ be the prices of stock A and stock B at time t_1 , and let $P_A(t_2)$ and $P_B(t_2)$ be the prices of stock A and stock B at a *later* time t_2 . All prices are fully adjusted for any splits and dividends. The corresponding returns (from t_1 to t_2) are

$$R_A = \frac{P_A(t_2)}{P_A(t_1)} - 1 \quad (3.18)$$

$$R_B = \frac{P_B(t_2)}{P_B(t_1)} - 1 \quad (3.19)$$

Since typically these returns are small, we can use an alternative definition:

$$R_A = \ln \left(\frac{P_A(t_2)}{P_A(t_1)} \right) \quad (3.20)$$

$$R_B = \ln \left(\frac{P_B(t_2)}{P_B(t_1)} \right) \quad (3.21)$$

Next, let \tilde{R}_A and \tilde{R}_B be the demeaned returns:

$$\bar{R} = \frac{1}{2} (R_A + R_B) \quad (3.22)$$

$$\tilde{R}_A = R_A - \bar{R} \quad (3.23)$$

$$\tilde{R}_B = R_B - \bar{R} \quad (3.24)$$

where \bar{R} is the mean return. A stock is “rich” if its demeaned return is positive, and it is “cheap” if its demeaned return is negative. The numbers of shares Q_A , Q_B to short/buy are fixed by the total desired dollar investment I (Eq. 3.25) and the requirement of dollar-neutrality (Eq. 3.26):

$$P_A |Q_A| + P_B |Q_B| = I \quad (3.25)$$

$$P_A Q_A + P_B Q_B = 0 \quad (3.26)$$

where P_A, P_B are the stock prices at the time t_* the position is established ($t_* \geq t_2$).¹⁸

3.9 Strategy: Mean-Reversion—Single Cluster

This is a generalization of the pairs trading strategy to $N > 2$ stocks that are historically highly correlated (e.g., stocks belonging to the same industry or sector). Let $R_i, i = 1, \dots, N$, be the returns for these N stocks:

$$R_i = \ln \left(\frac{P_i(t_2)}{P_i(t_1)} \right) \quad (3.27)$$

$$\bar{R} = \frac{1}{N} \sum_{i=1}^N R_i \quad (3.28)$$

$$\tilde{R}_i = R_i - \bar{R} \quad (3.29)$$

Following the pairs trading intuition, we can short stocks with positive \tilde{R}_i and buy stocks with negative \tilde{R}_i . We have the following conditions:

$$\sum_{i=1}^N P_i |Q_i| = I \quad (3.30)$$

$$\sum_{i=1}^N P_i Q_i = 0 \quad (3.31)$$

Here: I is the total desired dollar investment; Eq. (3.31) is the dollar-neutrality constraint; $Q_i < 0$ for short-sales; $Q_i > 0$ for buys; P_i are the prices at the time the position is established. We have 2 equations and $N > 2$ unknowns. A simple prescription (which is one out of myriad possibilities) for specifying Q_i is to have the dollar positions $D_i = P_i Q_i$ proportional to the demeaned returns:

$$D_i = -\gamma \tilde{R}_i \quad (3.32)$$

¹⁸For some literature on pairs trading, see, e.g., Bogomolov (2013), Bowen and Hutchinson (2016), Bowen et al. (2010), Caldeira and Moura (2013), Chen et al. (2017), Do and Faff (2010, 2012), Elliott et al. (2005), Engle and Granger (1987), Gatev et al. (2006), Huck (2009, 2015), Huck and Afawubo (2014), Jacobs and Weber (2015), Kakushadze (2015), Kim (2011), Kishore (2012), Krauss (2017), Krauss and Stübinger (2017), Liew and Wu (2013), Lin et al. (2006), Liu et al. (2017), Miao (2014), Perlin (2009), Pizzutilo (2013), Rad et al. (2016), Stübinger and Bredthauer (2017), Stübinger and Endres (2017), Vaitonis and Masteika (2016), Vidyamurthy (2004), Xie et al. (2014), Yoshikawa (2017), Zeng and Lee (2014).

where $\gamma > 0$ (recall that we short $\tilde{R}_i > 0$ stocks and buy $\tilde{R}_i < 0$ stocks). Then Eq. (3.31) is automatically satisfied, while Eq. (3.30) fixes γ :

$$\gamma = \frac{I}{\sum_{i=1}^N |\tilde{R}_i|} \quad (3.33)$$

Strategy: Mean-Reversion—Multiple Clusters

The mean-reversion strategy of Sect. 3.9 can be readily generalized to the case where we have $K > 1$ clusters such that stocks within each cluster are historically highly correlated.¹⁹ We can simply treat clusters independently from each other and construct a mean-reversion strategy following the above procedure in each cluster. Then, e.g., we can allocate investments to these K independent strategies uniformly.

There is a neat way of treating all clusters in a “unified” fashion using a linear regression. Let the K clusters be labeled by $A = 1, \dots, K$. Let Λ_{iA} be an $N \times K$ matrix such that if the stock labeled by i ($i = 1, \dots, N$) belongs to the cluster labeled by A , then $\Lambda_{iA} = 1$; otherwise, $\Lambda_{iA} = 0$. We will assume that each and every stock belongs to one and only one cluster (so there are no empty clusters):

$$N_A = \sum_{i=1}^N \Lambda_{iA} > 0 \quad (3.34)$$

$$N = \sum_{A=1}^K N_A \quad (3.35)$$

We have

$$\Lambda_{iA} = \delta_{G(i),A} \quad (3.36)$$

$$G : \{1, \dots, N\} \mapsto \{1, \dots, K\} \quad (3.37)$$

Here: G is the map between stocks and clusters; and Λ_{iA} is the loadings matrix.

¹⁹E.g., these clusters can correspond to sectors, such as energy, technology, healthcare, etc.

Now consider a linear regression of the stock returns R_i over Λ_{iA} (without the intercept and with unit weights):

$$R_i = \sum_{A=1}^K \Lambda_{iA} f_A + \varepsilon_i \quad (3.38)$$

where f_A are the regression coefficients given by (in matrix notation, where R is the N -vector R_i , f is the K -vector f_A , and Λ is the $N \times K$ matrix Λ_{iA})

$$f = Q^{-1} \Lambda^T R \quad (3.39)$$

$$Q = \Lambda^T \Lambda \quad (3.40)$$

and ε_i are the regression residuals. For binary Λ_{iA} given by Eq. (3.36), these residuals are nothing but the returns R_i demeaned w.r.t. to the corresponding cluster:

$$\varepsilon = R - \Lambda Q^{-1} \Lambda^T R \quad (3.41)$$

$$Q_{AB} = N_A \delta_{AB} \quad (3.42)$$

$$\bar{R}_A = \frac{1}{N_A} \sum_{j \in J_A} R_j \quad (3.43)$$

$$\varepsilon_i = R_i - \bar{R}_{G(i)} = \tilde{R}_i \quad (3.44)$$

where \bar{R}_A is the mean return for the cluster labeled by A , and \tilde{R}_i is the demeaned return obtained by subtracting from R_i the mean return for the cluster labeled by $A = G(i)$ to which the stock labeled by i belongs: $J_A = \{i | G(i) = A\} \subset \{1, \dots, N\}$.

The demeaned returns are cluster-neutral, i.e.,

$$\sum_{i=1}^N \tilde{R}_i \Lambda_{iA} = 0, \quad A = 1, \dots, K \quad (3.45)$$

Also, note that we automatically have (so D_i given by Eq. (3.32) satisfy Eq. (3.31))

$$\sum_{i=1}^N \tilde{R}_i v_i = 0 \quad (3.46)$$

where $v_i \equiv 1$, $i = 1, \dots, N$, i.e., the N -vector v is the unit vector. In the regression language, v is the intercept. We did not have to add the intercept to the loadings matrix Λ as it is already subsumed in it:

$$\sum_{A=1}^K \Lambda_{iA} = v_i \quad (3.47)$$

3.10 Mean-Reversion—Weighted Regression

The conditions (3.45) satisfied by the demeaned returns when the loadings matrix is binary simply mean that these returns are cluster-neutral, i.e., orthogonal to the K N -vectors $v^{(A)}$ comprising the columns of Λ_{iA} . Such orthogonality can be defined for any loadings matrix, not just a binary one. So, we can consider a generalization where the loadings matrix, call it Ω_{iA} , may have some binary columns, but generally it need not. The binary columns, if any, can, e.g., be industry (or sector) based risk factors; the non-binary columns are interpreted as some non-industry based risk factors; and the orthogonality condition

$$\sum_{i=1}^N \tilde{R}_i \Omega_{iA}, \quad A = 1, \dots, K \quad (3.48)$$

can be satisfied if the twiddled returns \tilde{R}_i are related to the residuals ε_i of the regression of R_i over Ω_{iA} with some (generally nonuniform) regression weights z_i via

$$\tilde{R} = Z \varepsilon \quad (3.49)$$

$$\varepsilon = R - \Omega Q^{-1} \Omega^T Z R \quad (3.50)$$

$$Z = \text{diag}(z_i) \quad (3.51)$$

$$Q = \Omega^T Z \Omega \quad (3.52)$$

If the intercept is included in Ω_{iA} (i.e., a linear combination of the columns of Ω_{iA} equals the unit N -vector v), then we automatically have

$$\sum_{i=1}^N \tilde{R}_i = 0 \quad (3.53)$$

The weights z_i can, e.g., be taken as $z_i = 1/\sigma_i^2$, where σ_i are historical volatilities.²⁰

3.11 Strategy: Single Moving Average

This strategy is based on the stock price crossing a moving average. One can use different types of moving averages (MAs), such as a simple moving average (SMA), or an exponential moving average (EMA)²¹:

$$\text{SMA}(T) = \frac{1}{T} \sum_{t=1}^T P(t) \quad (3.54)$$

$$\text{EMA}(T, \lambda) = \frac{\sum_{t=1}^T \lambda^{t-1} P(t)}{\sum_{t=1}^T \lambda^{t-1}} = \frac{1 - \lambda}{1 - \lambda^T} \sum_{t=1}^T \lambda^{t-1} P(t) \quad (3.55)$$

Here: $t = 1$ corresponds to the most recent time in the time series of historical stock prices $P(t)$; T is the length of the MA (t and T are usually measured in trading days); and $\lambda < 1$ is the factor which suppresses past contributions. Below MA will refer to SMA or EMA. A simple strategy is defined as follows (P is the price at $t = 0$, on the trading day immediately following the most recent trading day $t = 1$ in the time series $P(t)$):

$$\text{Signal} = \begin{cases} \text{Establish long/liquidate short position if } P > \text{MA}(T) \\ \text{Establish short/liquidate long position if } P < \text{MA}(T) \end{cases} \quad (3.56)$$

This strategy can be run as, e.g., long-only, short-only, or both long and short. It can be straightforwardly applied to multiple stocks (on a single-stock basis,

²⁰For some literature on mean-reversion (a.k.a. contrarian) strategies, see, e.g., Avellaneda and Lee (2010), Black and Litterman (1991, 1992), Cheung (2010), Chin et al. (2002), Conrad and Kaul (1998), Daniel (2001), Da Silva et al. (2009), Doan et al. (2014), Drobetz (2001), Hodges and Carverhill (1993), Idzorek (2007), Jansen and Nikiforov (2016), Jegadeesh and Titman (1995), Kakushadze (2015), Kang et al. (2002), Kudryavtsev (2012), Lakonishok et al. (1994), Lehmann (1990), Li et al. (2012), Liew and Roberts (2013), Lo and MacKinlay (1990), Mun et al. (2000), O'Tool (2013), Pole (2007), Poterba and Summers (1988), Satchell and Scowcroft (2000), Schiereck et al. (1999), Shi et al. (2015), Yao (2012).

²¹For $T \gg 1$ we have $\lambda^T \ll 1$ and $\text{EMA}(T, \lambda) \approx (1 - \lambda) P(1) + \lambda \text{EMA}(T - 1, \lambda)$, where $\text{EMA}(T - 1, \lambda)$ is based on $P(2), P(3), \dots, P(T)$. Also, for some literature on moving average based strategies, see, e.g., BenZion et al. (2003), Brock et al. (1992), Dzikevičius and Šaranda (2010), Edwards and Magee (1992), Faber (2007), Félix and Rodríguez (2008), Fifield et al. (2008), Fong and Yung (2005), Gençay (1996, 1998), Gençay and Stengos (1998), Glabadanidis (2015), Gunasekarage and Power (2001), Hung (2016), James (1968), Jasemi and Kimiagari (2012), Kilgallen (2012), Li et al. (2015), Lo et al. (2000), Metghalchi et al. (2012), Pătări and Vilska (2014), Taylor and Allen (1992), Weller et al. (2009), Zakamulin (2014, 2015).

with no cross-sectional interaction between the signals for individual stocks). With a large number of stocks, it may be possible to construct (near-)dollar-neutral portfolios.

3.12 Strategy: Two Moving Averages

The simplest variant of this strategy replaces the stock price P in Eq. (3.56) by another moving average. That is, we have 2 moving averages with lengths T' and T , where $T' < T$ (e.g., $T' = 10$ and $T = 30$), and the signal is given by:

$$\text{Signal} = \begin{cases} \text{Establish long/liquidate short position if } MA(T') > MA(T) \\ \text{Establish short/liquidate long position if } MA(T') < MA(T) \end{cases} \quad (3.57)$$

This signal can be augmented with additional “stop-loss” rules to protect realized profits. E.g., if a long position has been established, the trader can define a threshold to liquidate the long position if the stock begins to fall (even if the shorter moving average has not crossed the longer moving average yet):

$$\text{Signal} = \begin{cases} \text{Establish long position if } MA(T') > MA(T) \\ \text{Liquidate long position if } P < (1 - \Delta) \times P_1 \\ \text{Establish short position if } MA(T') < MA(T) \\ \text{Liquidate short position if } P > (1 + \Delta) \times P_1 \end{cases} \quad (3.58)$$

Here Δ is some predefined percentage, e.g., $\Delta = 2\%$. So, a long position is liquidated if the current price P falls over 2% below the previous day's price P_1 ; and a short position is liquidated if P rises over 2% above P_1 . Other variations can be used.

3.13 Strategy: Three Moving Averages

In some cases, using 3 moving averages with lengths $T_1 < T_2 < T_3$ (e.g., $T_1 = 3$, $T_2 = 10$, $T_3 = 21$) can help filter false signals:

$$\text{Signal} = \begin{cases} \text{Establish long position if } MA(T_1) > MA(T_2) > MA(T_3) \\ \text{Liquidate long position if } MA(T_1) \leq MA(T_2) \\ \text{Establish short position if } MA(T_1) < MA(T_2) < MA(T_3) \\ \text{Liquidate short position if } MA(T_1) \geq MA(T_2) \end{cases} \quad (3.59)$$

3.14 Strategy: Support and Resistance

This strategy uses “support” S and “resistance” R levels, which can be computed using the “pivot point” (a.k.a. the “center”) C as follows²²:

$$C = \frac{P_H + P_L + P_C}{3} \quad (3.60)$$

$$R = 2 \times C - P_L \quad (3.61)$$

$$S = 2 \times C - P_H \quad (3.62)$$

Here P_H , P_L and P_C are the previous day’s high, low and closing prices. One way to define a trading signal is as follows (as above, P is the current price):

$$\text{Signal} = \begin{cases} \text{Establish long position if } P > C \\ \text{Liquidate long position if } P \geq R \\ \text{Establish short position if } P < C \\ \text{Liquidate short position if } P \leq S \end{cases} \quad (3.63)$$

3.15 Strategy: Channel

This strategy amounts to buying and selling a stock when it reaches the floor and the ceiling of a channel, respectively. A channel is a range/band, bounded by a ceiling and a floor, within which the stock price fluctuates. The trader’s expectation may be that if the floor or the ceiling is reached, the stock price will bounce in the opposite direction. On the other hand, if the stock price breaks through the ceiling or the floor, the trader may conclude that a new trend has emerged and follow this new trend instead. A simple and common definition of a channel is the Donchian Channel (Donchian 1960), where the ceiling

²²Other definitions of the pivot point (e.g., using the current trading day’s open price) and higher/lower support/resistance levels exist. For some literature on support and resistance strategies, see, e.g., Amiri et al. (2010), Brock et al. (1992), Garzarelli et al. (2014), Hardy (1978), Kahneman and Tversky (1979), Murphy (1986), Osler (2000, 2003), Person (2007), Pring (1985), Shiu and Lu (2011), Thomsett (2003), Zapranis and Tsinaslanidis (2012).

B_{up} and the floor B_{down} are defined as follows (with the same notations as above)²³:

$$B_{up} = \max(P(1), P(2), \dots, P(T)) \quad (3.64)$$

$$B_{down} = \min(P(1), P(2), \dots, P(T)) \quad (3.65)$$

A simple trading strategy then is as follows:

$$\text{Signal} = \begin{cases} \text{Establish long/liquidate short position if } P = B_{down} \\ \text{Establish short/liquidate long position if } P = B_{up} \end{cases} \quad (3.66)$$

The wider the channel, the higher the volatility. Usually, the channel indicator is used together with other indicators. E.g., the signal can be more robust when a price reversal (or a channel break) occurs with an increase in the traded volume.

3.16 Strategy: Event-Driven—M&A

This strategy, referred to as “merger arbitrage” or “risk arbitrage”, attempts to capture excess returns generated via corporate actions such as mergers and acquisitions (M&A). A merger arbitrage opportunity arises when one publicly traded company intends to acquire another publicly traded company at a price that differs from the latter’s market price. In this regard, there are two main types of transactions: cash mergers and stock mergers. In the case of a cash merger, the trader establishes a long position in the target company stock. In the case of a stock merger, the trader establishes a long position in the target company stock (call it A) and a short position in the acquirer company stock (call it B). For instance, if the current price of A is \$67, the current price of B is \$35, and under the proposed stock merger deal each share of A is swapped for 2 shares of B, then the trader buys one share of A and shorts 2 shares of B generating an initial net credit of $\$3 = 2 \times \$35 - \$67$, which is the profit per each share of A bought if the deal goes through. The trader’s risk is in that, if the deal falls through, the trader will likely lose money on this trade.²⁴

²³For some additional literature on channel trading strategies, see, e.g., Batten and Ellis (1996), Birari and Rode (2014), Dempster and Jones (2002), De Zwart et al. (2009), Elder (2014), Sullivan et al. (1999).

²⁴For some literature on merger arbitrage, see, e.g., Andrade et al. (2001), Andrieș and Virlan (2017), Baker et al. (2012), Baker and Savaşoglu (2002), Bester et al. (2017), Brown and Raymond (1986), Cao et al. (2016), Cornelli and Li (2002), Dukes et al. (1992), Hall et al. (2013), Harford (2005), Hsieh and Walking (2005), Huston (2000), Jetley and Ji (2010), Karolyi and Shannon (1999), Khan (2002), Larker

3.17 Strategy: Machine Learning—Single-Stock KNN

Some strategies rely on machine learning techniques, such as the k -nearest neighbor (KNN) algorithm (see, e.g., Altman 1992; Samworth 2012), to predict future stock returns (the target variable) based on a set of predictor (feature) variables, which can be based on technical, fundamental and/or some other data. The strategy we describe here is a single-stock strategy, i.e., for each stock the target variable is predicted using the price and volume data only for this stock (but no cross-sectional data, i.e., no data for other stocks). The target variable $Y(t)$ is defined as the cumulative return over the next T trading days (as above, the ascending integer values of t , which is measured in trading days, correspond to going back in time):

$$Y(t) = \frac{P(t - T)}{P(t)} - 1 \quad (3.67)$$

The predictor variables $X_a(t)$, $a = 1, \dots, m$, are defined using prices $P(t')$ and volumes $V(t')$ at times t' before t (i.e., $t' > t$), so they are out-of-sample. Examples of such variables are moving averages of the price and volume of varying lengths:

$$X_1(t) = \frac{1}{T_1} \sum_{s=1}^{T_1} V(t + s) \quad (3.68)$$

$$X_2(t) = \frac{1}{T_2} \sum_{s=1}^{T_2} P(t + s) \quad (3.69)$$

$$X_3(t) = \frac{1}{T_3} \sum_{s=1}^{T_3} P(t + s) \quad (3.70)$$

$$\dots \quad (3.71)$$

The predictor variables are further normalized to lie between 0 and 1:

$$\tilde{X}_a(t) = \frac{X_a(t) - X_a^-}{X_a^+ - X_a^-} \quad (3.72)$$

and Lys (1987), Lin et al. (2013), Maheswaran and Yeoh (2005), Mitchell and Pulvino (2001), Officer et al. (2004, 2006), Samuelson and Rosenthal (1986), Subramanian (2004), Van Tassel (2016), Walkling (1985).

where X_a^+ and X_a^- are the maximum and minimum values of $X_a(t)$ over the training period. The final ingredient is the number k of the nearest neighbors (see below). For a given value of t we can take k nearest neighbors of the m -vector $\tilde{X}_a(t)$ among the m -vectors $\tilde{X}_a(t')$, $t' = t + 1, t + 2, \dots, t + T_*$, using the KNN algorithm (here T_* is the sample size). For KNN we can use the Euclidean distance $D(t, t')$ between $\tilde{X}_a(t)$ and $\tilde{X}_a(t')$ defined as

$$[D(t, t')]^2 = \sum_{a=1}^m (\tilde{X}_a(t) - \tilde{X}_a(t'))^2 \quad (3.73)$$

However, we can use some other distance (e.g., the Manhattan distance). Let the k nearest neighbors of $\tilde{X}_a(t)$ be $\tilde{X}_a(t'_\alpha(t))$, $\alpha = 1, \dots, k$. (Note that the k values $t'_\alpha(t)$ depend on t .) Then we can *define* the *predicted* value $\mathcal{Y}(t)$ simply as an average of the corresponding realized values $Y(t'_\alpha(t))$:

$$\mathcal{Y}(t) = \frac{1}{k} \sum_{\alpha=1}^k Y(t'_\alpha(t)) \quad (3.74)$$

Alternatively, we can, e.g., consider a linear model

$$\mathcal{Y}(t) = \sum_{\alpha=1}^k Y(t'_\alpha(t)) w_\alpha + v \quad (3.75)$$

and fix the coefficients w_α and v by running a regression²⁵ of the realized values $Y(t)$ over $Y(t'_\alpha(t))$ for some number—call it M —of values of t . I.e., we pull $Y(t)$ for these values of t into an M -vector and regress it over the $M \times k$ matrix of the corresponding values $Y(t'_\alpha(t))$. The coefficients of this regression are w_α and v .

The advantage of using Eq. (3.74) is simplicity—there are no parameters to train in this case. We still have to backtest the strategy (see below) out-of-sample. The disadvantage is that equally weighting contributions of all k nearest neighbors could be suboptimal. In this regard, there are various (e.g., distance-based) weighting schemes one may consider. Nontrivial weighting is precisely what Eq. (3.75) intends to capture. However, this requires training and cross-validation (using metrics such as root mean square error), and the fitted parameters w_α and v can be (and often are) out-of-sample unstable.

²⁵We can run this regression without the intercept, in which case we only have the coefficients w_α , or with the intercept, in which case we also have the coefficient v .

The data can be split, e.g., 60% for training and 40% for cross-validation. Ultimately, the strategy must backtest well out-of-sample.

The signal at $t = 0$ can be defined using the predicted value $\mathcal{Y} = \mathcal{Y}(0)$, which is the expected return for the next T days. For single-stock trading²⁶ one can simply define thresholds for establishing long and short trades, and liquidating existing positions, e.g., as follows²⁷:

$$\text{Signal} = \begin{cases} \text{Establish long position if } \mathcal{Y} > z_1 \\ \text{Liquidate long position if } \mathcal{Y} \leq z_2 \\ \text{Establish short position if } \mathcal{Y} < -z_1 \\ \text{Liquidate short position if } \mathcal{Y} \geq -z_2 \end{cases} \quad (3.76)$$

Here, z_1 and z_2 are trader-defined thresholds. This signal must be backtested out-of-sample. The number k of nearest neighbors can be optimized using a backtest (by trying a set of values of k). Alternatively, one can use a common heuristic, e.g., $k = \text{floor}(\sqrt{T_*})$ or $k = \text{ceiling}(\sqrt{T_*})$. Also see, e.g., (Hall et al. 2008).

3.18 Strategy: Statistical Arbitrage—Optimization

Let C_{ij} be the sample or model covariance matrix for the N stock returns in a portfolio.²⁸ Let D_i be the dollar holdings in our portfolio. The *expected*

²⁶Alternatively, one can use expected returns \mathcal{Y}_i computed for N stocks (where $N \gg 1$) using a machine learning algorithm as above and then use these expected returns in multi-stock cross-sectional strategies such as mean-reversion/statistical arbitrage.

²⁷For some literature on using machine learning for predicting stock returns, see, e.g., Adam and Lin (2001), Ang and Quek (2006), Chen (2014), Chen et al. (2003), Creamer and Freund (2007, 2010), Gestel et al. (2001), Grudnitski and Osborn (1993), Huang et al. (2005), Huang and Tsai (2009), Huerta et al. (2013), Kablan (2009), Kakushadze and Yu (2016b, 2017c, 2018), Kara et al. (2011), Kim (2003, 2006), Kim and Han (2000), Kordos and Cwiok (2011), Kryzanowski et al. (1993), Kumar and Thenmozhi (2001), Liew and Mayster (2018), Lu et al. (2009), Milosevic (2016), Novak and Velušček (2016), Ou and Wang (2009), Refenes et al. (1994), Rodríguez-González et al. (2011), Saad et al. (1998), Schumaker and Chen (2010), Subha and Nambi (2012), Tay and Cao (2001), Teixeira and de Oliveira (2010), Tsai and Hsiao (2010), Vanstone and Finnie (2009), Yao and Tan (2000), Yao et al. (1999), Yu et al. (2005).

²⁸The sample covariance matrix based on a time series of historical returns is singular if $T \leq N + 1$, where T is the number of observations in the time series. Even if it is nonsingular, unless $T \gg N$, which is rarely (if ever) the case, the off-diagonal elements of the sample covariance matrix typically are unstable out-of-sample. Therefore, in practice, typically a model covariance matrix (which is positive-definite and should be sufficiently stable out-of-sample) is used (see below).

portfolio P&L P , volatility V and Sharpe ratio S are given by

$$P = \sum_{i=1}^N E_i D_i \quad (3.77)$$

$$V^2 = \sum_{i,j=1}^N C_{ij} D_i D_j \quad (3.78)$$

$$S = P/V \quad (3.79)$$

Here E_i are the expected stock returns. Instead of the dollar holdings D_i , it is more convenient to work with dimensionless holding weights (which are positive/negative for long/short positions)

$$w_i = D_i/I \quad (3.80)$$

where I is the total investment level. The holding weights satisfy the condition

$$\sum_{i=1}^N |w_i| = 1 \quad (3.81)$$

We have $P = I \times \tilde{P}$, $V = I \times \tilde{V}$ and $S = \tilde{P}/\tilde{V}$, where

$$\tilde{P} = \sum_{i=1}^N E_i w_i \quad (3.82)$$

$$\tilde{V}^2 = \sum_{i,j=1}^N C_{ij} w_i w_j \quad (3.83)$$

To determine the portfolio weights w_i , often one requires that the Sharpe ratio (Sharpe 1966, 1994) be maximized:

$$S \rightarrow \max \quad (3.84)$$

Assuming no additional conditions on w_i (e.g., upper or lower bounds), the solution to Eq. (3.84) in the absence of trading costs is given by

$$w_i = \gamma \sum_{j=1}^N C_{ij}^{-1} E_j \quad (3.85)$$

where C^{-1} is the inverse of C , and the normalization coefficient γ is determined from Eq. (3.81) (and $\gamma > 0$ so $\tilde{P} > 0$). The weights given by Eq. (3.85) generically do not correspond to a dollar-neutral portfolio. To have a dollar-neutral portfolio, we need to maximize the Sharpe ratio subject to the dollar-neutrality constraint.

Dollar-Neutrality

We can achieve dollar-neutrality as follows. In the absence of bounds, trading costs, etc., the Sharpe ratio is invariant under simultaneous rescalings of all holding weights $w_i \rightarrow \zeta w_i$, where $\zeta > 0$. Due to this scale invariance, the Sharpe ratio maximization problem can be recast in terms of minimizing a quadratic objective function:

$$g(w, \lambda) = \frac{\lambda}{2} \sum_{i,j=1}^N C_{ij} w_i w_j - \sum_{i=1}^N E_i w_i \quad (3.86)$$

$$g(w, \lambda) \rightarrow \min \quad (3.87)$$

where $\lambda > 0$ is a parameter, and minimization is w.r.t. w_i . The solution is given by

$$w_i = \frac{1}{\lambda} \sum_{j=1}^N C_{ij}^{-1} E_j \quad (3.88)$$

and λ is fixed via Eq. (3.81). The objective function approach—which is the mean-variance optimization (Markowitz 1952)—is convenient if we wish to impose *linear homogeneous* constraints (which do not spoil the aforesaid scale invariance) on w_i , e.g., the dollar-neutrality constraint. We introduce a Lagrange multiplier μ ²⁹:

$$g(w, \mu, \lambda) = \frac{\lambda}{2} \sum_{i,j=1}^N C_{ij} w_i w_j - \sum_{i=1}^N E_i w_i - \mu \sum_{i=1}^N w_i \quad (3.89)$$

$$g(w, \mu, \lambda) \rightarrow \min \quad (3.90)$$

²⁹By introducing multiple Lagrange multipliers, we can have multiple linear homogeneous constraints (see, e.g., Kakushadze 2015).

Minimization w.r.t. w_i and μ now gives the following equations:

$$\lambda \sum_{j=1}^N C_{ij} w_j = E_i + \mu \quad (3.91)$$

$$\sum_{i=1}^N w_i = 0 \quad (3.92)$$

So we have dollar-neutrality. The solution to Eqs. (3.91) and (3.92) is given by:

$$w_i = \frac{1}{\lambda} \left[\sum_{j=1}^N C_{ij}^{-1} E_j - \sum_{j=1}^N C_{ij}^{-1} \frac{\sum_{k,l=1}^N C_{kl}^{-1} E_l}{\sum_{k,l=1}^N C_{kl}^{-1}} \right] \quad (3.93)$$

By construction, w_i satisfy the dollar-neutrality constraint (3.92), and λ is fixed via Eq. (3.81). The expected returns E_i can be based on mean-reversion, momentum, machine learning or other signals. Equation (3.93) constructs a dollar-neutral portfolio with “risk management” built in. E.g., the weights w_i (roughly) are suppressed by stock volatilities σ_i (where $\sigma_i^2 = C_{ii}$) assuming that on average $|E_i|$ are of order σ_i .³⁰

The above implementation of the dollar-neutrality constraint via minimizing the quadratic objective function (3.89) is equivalent to imposing this constraint in Sharpe ratio maximization as no trading costs, position/trading bounds, nonlinear/inhomogeneous constraints, etc., are present. More generally Sharpe ratio maximization is not equivalent to minimizing a quadratic objective function (see, e.g., Kakushadze 2015), albeit in practice usually the latter approach is used.

³⁰Typically, C_{ij} is a multifactor risk model covariance matrix. For a general discussion, see, e.g., Grinold and Kahn (2000). For explicit implementations (including source code), see, e.g., Kakushadze (2015d), Kakushadze and Yu (2016a, 2017a). For multifactor models, the weights are *approximately* neutral w.r.t. the columns of the factor loadings matrix. The exact neutrality is attained in the zero specific risk limit, where optimization reduces to a weighted regression (see, e.g., Kakushadze 2015).

3.19 Strategy: Market-Making

Over-simplistically, this strategy amounts to capturing the bid-ask spread for a given stock and can be (again, over-simplistically) summarized as follows:

$$\text{Rule} = \begin{cases} \text{Buy at the bid} \\ \text{Sell at the ask} \end{cases} \quad (3.94)$$

In a market where most order flow is “dumb” (or uninformed), this strategy on average would work very well. However, in a market where most order flow is “smart” (or informed, i.e., “toxic”), this strategy, as stated, would lose money. This is because of *adverse selection*, where, precisely because most order flow is smart, most fills at the bid (ask) would be when the market is trading through it downward (upward), so these trades would lose money. Furthermore, most limit orders to buy (sell) at the bid (ask) would never be filled as the price would run away from them, i.e., increase (decrease). So, ideally, this strategy should be structured such that it captures dumb order flow and avoids smart order flow, which is not that simple.

One approach is, at any given time, within a short time horizon, to stay on the “right” side of the market, i.e., to have a short-horizon signal indicating the direction of the market and place limit orders accordingly (to buy at the bid if the signal indicates a price increase, and to sell at the ask if the signal indicates a price decrease). If the signal were (magically) 100% correct, this would capture the dumb order flow assuming that the orders get filled. This is a big assumption as for this to be guaranteed, the trader would have to be #1 in the queue among many other market participants placing limit orders at the same price point. This is where high frequency trading comes in—it is essentially all about speed with which orders are placed, canceled, and cancel-replaced. Infrastructure and technology are key in this.

Another possibility is to modulate the short-horizon signal with a longer-horizon signal (which can still be an intraday signal). The longer-horizon signal typically will have a higher cents-per-share³¹ than the shorter-horizon signal. Now certain trades can be profitable even with adverse selection, because they are established based on the longer-horizon signal. I.e., they “lose money” in the short term due to adverse selection (as the market trades through the corresponding limit orders), but they make money in a longer term. The market-making aspect of this is valuable as placing a passive limit order as

³¹“Cents-per-share” is defined as the realized P&L in cents (as opposed to dollars) divided by the total shares traded (which includes both establishing and liquidating trades). Note that the longer-horizon signal generally has a lower Sharpe ratio than the shorter-horizon signal.

opposed to an aggressive market or limit order saves money. On the other hand, in some cases, if the longer-horizon signal is strong enough and the shorter-horizon signal is in the same direction, a passive limit order would likely not get filled and it may make more sense to place an aggressive order. Such aggressive order flow is not dumb but smart, as it is based on nontrivial short- and long-horizon signals with a positive expected return.³² And speed still matters.

3.20 Strategy: Alpha Combos

With technological advances—hardware becoming cheaper and more powerful—it is now possible to data mine hundreds of thousands and even millions of alphas using machine learning methods. Here the term “alpha”—following common trader lingo—generally means any reasonable “expected return” that one may wish to trade on and is not necessarily the same as the “academic” alpha.³³ In practice, often the detailed information about how alphas are constructed may not even be available, e.g., the only data available could be the position data, so “alpha” then is a set of instructions to achieve certain stock (or some other instrument) holdings by some times t_1, t_2, \dots . Also, “machine learning” here refers to sophisticated methods that go beyond single-stock methods such as those discussed in Sect. 3.17 and involve cross-sectional analyses based on price-volume as well as other types of data (e.g., market cap, some other fundamental data such as earnings, industry classification data, sentiment data, etc.) for a large number of stocks (typically, a few thousand and up). 101 explicit examples of such quantitative trading alphas are given

³²Dumb order flow can come from, e.g., uninformed retail traders. It can also come from ultra-long-horizon institutional traders (mutual funds, pension funds, etc.), whose outlook can be months or years and who are not concerned about a few pennies’ worth of difference in the execution price on short horizons (i.e., this is only “short-term dumb” order flow). For a more detailed discussion, see, e.g., Kakushadze (2015c), Lo (2008). For some literature on high frequency trading and market-making, see, e.g., Aldridge (2013), Anand and Venkataraman (2016), Avellaneda and Stoikov (2008), Baron et al. (2014), Benos et al. (2017), Benos and Sagade (2016), Biais and Foucault (2014), Biais et al. (2014), Bowen et al. (2010), Bozdog et al. (2011), Brogaard et al. (2014, 2015), Brogaard and Garriott (2018), Budish et al. (2015), Carrion (2013), Carrion and Kolay (2017), Easley et al. (2011, 2012), Egginton et al. (2016), Hagströmer and Nordén (2013), Hagströmer et al. (2014), Harris and Namvar (2016), Hasbrouck and Saar (2013), Hendershott et al. (2011, 2013), Hendershott and Riordan (2013), Hirschey (2018), Holden and Jacobsen (2014), Jarrow and Protter (2012), Khandani and Lo (2011), Kirilenko et al. (2017), Korajczyk and Murphy (2017), Kozhan and Tham (2012), Li et al. (2014), Madhavan (2012), Menkveld (2013), Menkveld (2016), Muthuswamy et al. (2011), O’Hara (2015), Pagnotta and Philippon (2012), Riordan and Storckenmaier (2012), Van Kervel and Menkveld (2017).

³³By “academic” alpha we mean Jensen’s alpha (Jensen 1968) or a similar performance index.

in Kakushadze (2016).³⁴ The flipside is that these ubiquitous alphas are faint, ephemeral and cannot be traded on their own as any profit on paper would be eaten away by trading costs. To mitigate this, one combines a large number of such alphas and trades the so-combined “mega-alpha”. Hence “alpha combo” strategies.

This is not critical, but for definiteness let us assume that all alphas trade the same underlying instruments, even more concretely, the same universe of (say, 2500) most liquid U.S. stocks. Each alpha produces desired holdings for this trading universe. What we need is the weights with which to combine individual alphas, whose number N can be large (in hundreds of thousands or even millions).³⁵ Here is a procedure for fixing the alpha weights w_i , $i = 1, \dots, N$ (Kakushadze and Yu 2017b) (also see Kakushadze and Yu 2018):

- (1) Start with a time series of realized *alpha* returns³⁶ R_{is} , $i = 1, \dots, N$, $s = 1, \dots, M + 1$.
- (2) Calculate the serially demeaned returns $X_{is} = R_{is} - \frac{1}{M+1} \sum_{s=1}^{M+1} R_{is}$.
- (3) Calculate sample variances of alpha returns³⁷ $\sigma_i^2 = \frac{1}{M} \sum_{s=1}^{M+1} X_{is}^2$.
- (4) Calculate the normalized demeaned returns $Y_{is} = X_{is}/\sigma_i$.
- (5) Keep only the first M columns in Y_{is} : $s = 1, \dots, M$.
- (6) Cross-sectionally demean Y_{is} : $\Lambda_{is} = Y_{is} - \frac{1}{N} \sum_{j=1}^N Y_{js}$.
- (7) Keep only the first $M - 1$ columns in Λ_{is} : $s = 1, \dots, M - 1$.
- (8) Take the expected alpha returns E_i and normalize them: $\tilde{E}_i = E_i/\sigma_i$. One (but by far not the only) way of computing expected alpha returns is via d -day moving averages (note that d need not be the same as T):

$$E_i = \frac{1}{d} \sum_{s=1}^d R_{is} \quad (3.95)$$

- (9) Calculate the residuals $\tilde{\varepsilon}_i$ of the regression (without the intercept and with unit weights) of \tilde{E}_i over Λ_{is} .
- (10) Set the alpha portfolio weights to $w_i = \eta \tilde{\varepsilon}_i/\sigma_i$.
- (11) Set the normalization coefficient η such that $\sum_{i=1}^N |w_i| = 1$.

³⁴This is a secretive field, so literature on this subject is very scarce. Also see, e.g., Kakushadze and Tulchinsky (2016), Tulchinsky et al. (2015).

³⁵Note that N here refers to the number of alphas, not the number of underlying stocks.

³⁶Here $s = 1, \dots, T = M + 1$ labels the times t_s , where, as before, t_1 corresponds to the most recent time (albeit the time direction is not crucial below), and the alpha returns are $R_{is} = R_i(t_s)$. Typically, the alpha returns are computed daily, from close to close.

³⁷Their normalization is immaterial in what follows.

3.21 A Few Comments

We end this section with a few comments on some of the stock trading strategies discussed above. First, single-stock technical analysis strategies (i.e., those based solely on single-stock as opposed to cross-sectional data) such as those based on moving averages, support and resistance, channel and even single-stock KNN, are deemed “unscientific” by many professionals and academics. On the face of it, “fundamentally” speaking (not to be confused with fundamental analysis), there is no reason why, say, a short moving average crossing a long moving average should have any forecasting power.³⁸ This is not to say that moving averages are “unscientific” or that they should not be used. After all, e.g., trend following/momentum strategies are based on moving averages, i.e., the expected returns are computed via moving averages. However, looking at a large cross-section of stocks brings in a *statistical* element into the game. Mean-reversion is expected to work because stocks are expected to be correlated if they belong to the same industries, etc. This relates back to fundamental analysis and—even more importantly—to the investors’ *perception* of how stock prices/returns “should” behave based on the companies’ fundamentals. However, here too it is important to keep in mind that the stock market—an imperfect man-made construct—is not governed by laws of nature the same way as, say, the motion of planets in the solar system is governed by fundamental laws of gravity (see, e.g., Kakushadze 2015c). The markets behave the way they do because their participants behave in certain ways, which are sometimes irrational and certainly not always efficient. In this regard, the key difference between technical analysis strategies and statistical arbitrage strategies is that the latter are based on certain perceptions trickled down from longer holding horizons (fundamental analysis based strategies) to shorter horizons (statistical arbitrage) further enhanced by statistics, i.e., the fact that these strategies are based on a large number of stocks whose properties are further “stratified” according to some statistical and other features.

This brings us to the second point relating to precisely these “stratifications” in the context of statistical arbitrage. Thus, in Sect. 3.10 we can use a binary industry classification matrix as the loadings matrix Ω_{iA} . Such industry classifications are based on pertinent fundamental/economic data, such as companies’ products and services, revenue sources, suppliers, competitors, partners, etc. They are essentially independent of the pricing data and, if well-built, tend to be rather stable out-of-sample as companies seldom jump industries. However, binary classifications can also be built based purely on pricing data, via

³⁸ *Arguendo*, the momentum effect may appear to provide a basis for such forecasting power in some cases. However, then one could argue, e.g., that these are momentum strategies in disguise.

clustering algorithms (see, e.g., Kakushadze and Yu 2016b). Alternatively, the matrix Ω_{iA} can be non-binary and built using, say, principal components (see, e.g., Kakushadze and Yu 2017a). Some of the columns of Ω_{iA} can be based on longer-horizon style risk factors such as value, growth, size, momentum, liquidity and volatility (see, e.g., Ang et al. 2006; Anson 2013; Asness 1995; Asness et al. 2000, 2001; Banz 1981; Basu 1977; Fama and French 1992, 1993; Haugen 1995; Jegadeesh and Titman 1993; Lakonishok et al. 1994; Liew and Vassalou 2000; Pástor and Stambaugh 2003; Scholes and Williams 1977),³⁹ or shorter-horizon style factors (Kakushadze 2015b).

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³⁹For (il)liquidity related considerations, also see, e.g., Amihud (2002).

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4

Exchange-Traded Funds (ETFs)

4.1 Strategy: Sector Momentum Rotation

Empirical evidence suggests that the momentum effect exists not only for individual stocks but also for sectors and industries.¹ A sector momentum rotation strategy is based on overweighting holdings in outperforming sectors and underweighting holdings in underperforming sectors, where the “outperformance” and “underperformance” are based on momentum during the past T -month formation period (which typically ranges from 6 to 12 months). ETFs concentrated in specific sectors/industries offer a simple way to implement sector/industry rotation without having to buy or sell a large number of underlying stocks. Similarly to Sect. 3.1, as a measure of sector/industry momentum, we can use the corresponding ETF’s cumulative return:

$$R_i^{cum}(t) = \frac{P_i(t)}{P_i(t+T)} - 1 \quad (4.1)$$

Here, $P_i(t)$ is the price of the ETF labeled by i . (As above, $t+T$ is T months in the *past* w.r.t. t .) Right after time t , the trader can, e.g., buy the ETFs in the top decile by $R_i^{cum}(t)$ and hold the portfolio for a holding period (typically 1 to 3 months). Dollar-neutral strategies can also be constructed by, e.g., buying

¹For some pertinent literature, see, e.g., Cavaglia and Vadim (2002), Conover et al. (2008), Doeswijk and Vliet (2011), Dolvin and Kirby (2011), Gao and Ren (2015), Hong et al. (2007), Levis and Liodakis (1999), Moskowitz and Grinblatt (1999), O’Neal (2000), Sefton and Scowcroft (2005), Simpson and Grossman (2016), Sorensen and Burke (1986), Stovall (1996), Swinkels (2002), Szakmary and Zhou (2015), Wang et al. (2017).

ETFs in the top decile and shorting ETFs in the bottom decile (as stocks, ETFs can be shorted).²

Strategy: Sector Momentum Rotation with MA filter

This is a variation/refinement of the sector momentum rotation strategy. An ETF in the top (bottom) decile is bought (sold) only if it passes an additional filter based on a moving average $MA(T')$ of this ETF's price:

$$\text{Rule} = \begin{cases} \text{Buy top-decile ETFs only if } P > MA(T') \\ \text{Short bottom-decile ETFs only if } P < MA(T') \end{cases} \quad (4.2)$$

Here, P is the ETF's price at the time of the transaction, and $MA(T')$ is computed using *daily* prices (T' can but need not be equal T ; e.g., T' can be 100–200 days).

Strategy: Dual-Momentum Sector Rotation

In long-only strategies, to mitigate the risk of buying ETFs when the broad market is trending down, relative (i.e., cross-sectional) momentum of sector ETFs can be augmented by the absolute (i.e., time-series) momentum of, e.g., a broad market index ETF (see, e.g., Antonacci 2014, 2017).³ So, a long position based on the sector rotation signal (discussed above) is established only if the broad market index has an upward trend; otherwise, the total available funds are invested into an ETF (e.g., gold or Treasury ETF) uncorrelated with the broad market index:

$$\text{Rule} = \begin{cases} \text{Buy top-decile ETFs if } P > MA(T') \\ \text{Buy an uncorrelated ETF if } P \leq MA(T') \end{cases} \quad (4.3)$$

Here, P is the broad market index ETF's price at the time of the transaction, and $MA(T')$ is the moving average of this ETF's price. Typically, T' is 100–200 days.

²For some literature on ETFs, see, e.g., Agapova (2011), Aldridge (2016), Ben-David et al. (2017), Bhattacharya et al. (2017), Buéto and Henderson (2012), Clifford et al. (2014), Hill et al. (2015), Krause et al. (2014), Madhavan (2016), Madura and Ngo (2008), Nyaradi (2010), Oztekin et al. (2017).

³For some additional literature on relative momentum, absolute momentum and related topics, see, e.g., Ahn et al. (2003), Bandarchuk and Hilscher (2013), Berk et al. (1999), Cooper et al. (2004), Fama and French (2008), Hurst et al. (2017), Johnson (2002), Liu and Zhang (2008), Moskowitz et al. (2012), Sagi and Seasholes (2007), Schwert (2003), Zhang (2006).

4.2 Strategy: Alpha Rotation

This is the same as the sector momentum rotation strategy with the cumulative ETF returns R_i^{cum} replaced by ETF alphas α_i , which are the regression coefficients corresponding to the intercept in a *serial* regression of the ETF returns⁴ $R_i(t)$ over, e.g., the 3 Fama–French factors $MKT(t)$, $SMB(t)$, $HML(t)$ (see fn. 16 in Sect. 3.7)⁵:

$$R_i(t) = \alpha_i + \beta_{1,i} MKT(t) + \beta_{2,i} SMB(t) + \beta_{3,i} HML(t) + \epsilon_i(t) \quad (4.4)$$

4.3 Strategy: R-squared

Empirical studies for mutual funds (see, e.g., Amihud and Goyenko 2013; Ferson and Mo 2016) and ETFs (see, e.g., Garyn-Tal 2014a, b) suggest that augmenting alpha by an indicator based on R^2 of a *serial* regression of the returns $R_i(t)$ over multiple factors, e.g., the 3 Fama–French factors $MKT(t)$, $SMB(t)$, $HML(t)$ plus Carhart’s momentum factor $MOM(t)$ (see fn. 16 in Sect. 3.7), adds value in forecasting future returns. Thus, from the serial regression

$$R_i(t) = \alpha_i + \beta_{1,i} MKT(t) + \beta_{2,i} SMB(t) + \beta_{3,i} HML(t) + \beta_{4,i} MOM(t) + \epsilon_i(t) \quad (4.5)$$

we can estimate α_i (the regression coefficients corresponding to the intercept) and the regression R^2 , which is defined as (“SS” stands for “sum of squares”):

$$R^2 = 1 - \frac{SS_{res}}{SS_{tot}} \quad (4.6)$$

$$SS_{res} = \sum_{i=1}^N \epsilon_i^2(t) \quad (4.7)$$

⁴Typically, the estimation period is 1 year, and $R_i(t)$ are daily or weekly returns.

⁵Alpha here is Jensen’s alpha defined for ETF returns as opposed to mutual fund returns as in Jensen (1968). For some additional literature related to Jensen’s alpha, see, e.g., Bollen and Busse (2005), Droms and Walker (2001), Elton et al. (1996), Goetzmann and Ibbotson (1994), Grinblatt and Titman (1992), Jan and Hung (2004).

$$SS_{tot} = \sum_{i=1}^N (R_i(t) - \bar{R}(t))^2 \quad (4.8)$$

$$\bar{R}(t) = \frac{1}{N} \sum_{i=1}^N R_i(t) \quad (4.9)$$

An R-squared strategy then amounts to overweighting ETFs with higher “selectivity” (defined as $1 - R^2$ [Amihud and Goyenko 2013]) and underweighting ETFs with lower “selectivity”. E.g., one can first sort ETFs into quintiles by R^2 , and then sort ETFs in each such quintile into further sub-quintiles by alpha (resulting in 25 groups of ETFs). One can then, e.g., buy ETFs in the group corresponding to the lowest R^2 quintile and its highest alpha sub-quintile and sell ETFs in the group corresponding to the highest R^2 quintile and its lowest alpha sub-quintile. Other variations are possible. Finally, the estimation period and the returns for R^2 can be the same as in the alpha rotation strategy (see Sect. 4.2 and fn. 4). However, longer estimation periods can be considered, especially if $R_i(t)$ are monthly returns.⁶

4.4 Strategy: Mean-reversion

One way (among myriad others) to construct a mean-reversion strategy for ETFs is to use the Internal Bar Strength (IBS) based on the previous day’s close P_C , high P_H and low P_L prices⁷:

$$IBS = \frac{P_C - P_L}{P_H - P_L} \quad (4.10)$$

Note that IBS ranges from 0 to 1.⁸ An ETF can be thought of as being “rich” if its IBS is close to 1, and as “cheap” if its IBS is close to 0. Upon sorting a universe of ETFs cross-sectionally by IBS, a dollar-neutral strategy can, e.g., be constructed by selling ETFs in the top decile and buying ETFs in the bottom

⁶Also, note that in Amihud and Goyenko (2013) R^2 is a measure of active management of a mutual fund. In Garyn-Tal (2014a, b) R^2 is applied to actively managed ETFs. For some additional literature on actively managed ETFs, see, e.g., Mackintosh (2017), Meziani (2015), Rompotis (2011a, b), Schizas (2014), Sherrill and Upton (2018).

⁷See, e.g., Pagonidis (2014). For some additional related literature, see, e.g., Brown et al. (2018), Caginalp et al. (2014), Chan (2013), Dunis et al. (2013), Lai et al. (2016), Levy and Lieberman (2013), Marshall et al. (2013), Rudy et al. (2010), Schizas et al. (2011), Smith et al. (2015), Yu and Webb (2014).

⁸An equivalent but more symmetrical measure is $Y = IBS - 1/2 = (P_C - P_*) / (P_H - P_L)$, where $P_* = (P_H + P_L) / 2$. Note that Y ranges from $1/2$ for $P_C = P_H$ to $-1/2$ for $P_C = P_L$.

decile. As with stock strategies discussed above, weights can be uniform for all long and all short ETFs, respectively, or nonuniform, e.g., based on historical ETF volatilities. Furthermore, mean-reversion strategies we discussed above for stocks can also be adapted to ETFs.

4.5 Strategy: Leveraged ETFs (LETFs)

A leveraged (inverse) ETF seeks to double or triple (the inverse of) the daily return of its underlying index.⁹ To maintain a daily leverage of $2\times$ or $3\times$, LETFs rebalance every day, which requires buying on the days when the market is up and selling when the market is down. This can result in a negative drift in the long term, which can be exploited by shorting both a leveraged ETF and a leveraged inverse ETF (both with the same leverage and for the same underlying index) and investing the proceeds into, e.g., a Treasury ETF. This strategy can have a significant downside risk in the short term if one of the short ETF legs has a sizable positive return.

4.6 Strategy: Multi-asset Trend Following

One allure of ETFs is their diversification power: ETFs allow to gain exposure to different sectors, countries, asset classes, factors, etc., by taking positions in a relatively small number of ETFs (as opposed to taking positions in a large number of underlying instruments, e.g., thousands of stocks). Here, we focus on long-only trend-following portfolios. One needs to determine the weight w_i of each ETF. One (but by far not the only) way to fix these weights is as follows. First, as in the sector momentum rotation strategy, we compute cumulative returns R_i^{cum} (over some period T , e.g., 6–12 months). We only take ETFs with positive R_i^{cum} . If desired, optionally, we can further filter out ETFs as in the sector momentum rotation strategy with an MA filter, by keeping only the ETFs whose last closing prices P_i are higher than their corresponding long-term moving averages $MA_i(T')$ (typically, the MA length T' is 100–200 days). Now, instead of taking ETFs in the top decile by R_i^{cum} (as in the sector momentum rotation strategy), we can assign nonzero weights

⁹For some literature on leveraged ETFs, see e.g., Avellaneda and Zhang (2010), Bai et al. (2015), Charupat and Miu (2011), Cheng and Madhavan (2010), Ivanov and Lenkey (2014), Jarrow (2010), Jiang and Peterburgsky (2017), Lu et al. (2012), Shum et al. (2016), Tang and Xu (2013), Trainor (2010), Tuzun (2013).

w_i to all remaining ETFs, whose number in this context is relatively small to begin with by design. The weights can, e.g., be assigned as follows:

$$w_i = \gamma_1 R_i^{cum} \quad (4.11)$$

$$w_i = \gamma_2 R_i^{cum} / \sigma_i \quad (4.12)$$

$$w_i = \gamma_3 R_i^{cum} / \sigma_i^2 \quad (4.13)$$

Here: σ_i is the historical volatility; and the overall normalization coefficients $\gamma_1, \gamma_2, \gamma_3$ in each case are computed based on the requirement that $\sum_{i=1}^N w_i = 1$ (where N is the number of ETFs in our portfolio after all filters are applied, i.e., those with nonzero weights). Thus, the weights in Eq. (4.11) are simply proportional to the past cumulative returns R_i^{cum} , which are taken as the measure of momentum, so the expected returns are also given by (or, more precisely, proportional to) R_i^{cum} . The issue with this weighting scheme is that it overweighs volatile ETFs as on average $R_i^{cum} \propto \sigma_i$. The weights in Eq. (4.12) mitigate this, while the weights in Eq. (4.13) actually optimize the Sharpe ratio of the ETF portfolio assuming a diagonal covariance matrix $C_{ij} = \text{diag}(\sigma_i^2)$ for the ETF returns, i.e., by ignoring their correlations.¹⁰ Imposing bounds $w_i \leq w_i^{max}$ can further mitigate overweighing.

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¹⁰For some literature on multi-asset portfolios, dynamic asset allocation and related topics, see, e.g., Bekkers et al. (2009), Black and Litterman (1992), Detemple and Rindisbacher (2010), Doeswijk et al. (2014), Faber (2015, 2016), Mladina (2014), Petre (2015), Sassetti and Tani (2006), Sharpe (2009), Sharpe and Perold (2009), Sørensen (1999), Tripathi and Garg (2016), Wu (2003), Zakamulin (2014).

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5

Fixed Income

5.1 Generalities

Zero-Coupon Bonds

A promise of being paid \$1 at the maturity time T can be regarded as an asset, which has some worth at time t before T . This asset is called a (zero-coupon) *discount bond*. Let its price at time $0 \leq t \leq T$ be $P(t, T)$. Then $P(T, T) = 1$. The *yield* of a discount bond is defined as¹

$$R(t, T) = -\frac{\ln(P(t, T))}{T - t} \quad (5.1)$$

and has the meaning of an average interest rate over the period of time $T - t$. The higher the bond price at time t , the lower the yield $R(t, T)$ and vice versa. Below we refer to a zero-coupon bond with a \$1 principal and maturity T as a T -bond.

Bonds with Coupons

In practice, a bond usually pays not only its principal at maturity T , but also makes smaller coupon payments before maturity. Consider a bond that

¹More precisely, this definition assumes continuous compounding. For periodic compounding at n discrete times $T_i = T_0 + i\delta$, $i = 1, \dots, n$, the yield between $t = T_0$ and $t = T_n$ is given by $R(T_0, T_n) = \delta^{-1} ([P(T_0, T_n)]^{-1/n} - 1)$ assuming $P(T_n, T_n) = 1$, i.e., T_n is the maturity. Equation (5.1) is recovered in the limit where $n \rightarrow \infty$, $\delta \rightarrow 0$, $n\delta = \text{fixed}$ (and equal to $T - t$ in Eq. (5.1)).

makes n regular coupon payments at a fixed *uncompounded* rate k at times $T_i = T_0 + i\delta$, $i = 1, 2, \dots, n$, and also pays \$1 principal at maturity T . The amount of each coupon payment is $k\delta$, where δ is the payment period. This income stream is equivalent to owning one T -bond plus $k\delta$ units of each T_i -bond, $i = 1, \dots, n$. The price of the coupon bond at time t then is

$$P_c(t, T) = P(t, T) + k\delta \sum_{i=I(t)}^n P(t, T_i) \quad (5.2)$$

where $I(t) = \min(i : t < T_i)$. At time $t = T_0$ we have

$$P_c(T_0, T) = P(T_0, T) + k\delta \sum_{i=1}^n P(T_0, T_i) \quad (5.3)$$

If we desire the coupon bond to start with its face value ($P_c(T_0, T) = 1$), then the corresponding coupon rate is given by

$$k = \frac{1 - P(T_0, T)}{\delta \sum_{i=1}^n P(T_0, T_i)} \quad (5.4)$$

Floating Rate Bonds

A bond might also have *floating* coupon payments. Thus, consider a bond that pays \$1 at maturity T , and also makes coupon payments at times $T_i = T_0 + i\delta$, $i = 1, 2, \dots, n$, with amounts based on the variable rate (usually LIBOR—see Sect. 5.15)

$$L(T_{i-1}) = \frac{1}{\delta} \left[\frac{1}{P(T_{i-1}, T_i)} - 1 \right] \quad (5.5)$$

The actual coupon payment at time T_i is

$$X_i = L(T_{i-1})\delta = \frac{1}{P(T_{i-1}, T_i)} - 1 \quad (5.6)$$

which is the amount of interest we would get by buying \$1's worth of a T_i -bond at time T_{i-1} . Indeed, a T_i -bond is worth $P(T_{i-1}, T_i)$ at $t = T_{i-1}$, so \$1's worth a T_i -bond at $t = T_{i-1}$ is worth $1/P(T_{i-1}, T_i)$ at $t = T_i$, so the

interest earned is given by Eq. (5.6). The total value of the variable coupon bond at $t = T_0$ is given by:

$$V_0 = 1 - [P(T_0, T_n) - P(T_0, T)] \quad (5.7)$$

If $T = T_n$, then we have $V_0 = 1$. This is because this bond is equivalent to the following sequence of trades. At time $t = T_0$ take \$1 and buy T_1 -bonds with it. At time $t = T_1$ take the interest from the T_1 -bonds as the T_1 -coupon, and buy T_2 -bonds with the leftover \$1 principal. Repeat until we are left with \$1 at time T_n . This has exactly the same cash flow as the variable coupon bond, so the initial prices must match. If $T > T_n$, then $V_0 < 1$ and can be determined as follows. First, note that

$$V_0 = P(T_0, T) + V_0^{coupons} \quad (5.8)$$

where $V_0^{coupons}$ is the total value of all n coupon payments at $t = T_0$. This value is independent of T and is determined from

$$P(T_0, T_n) + V_0^{coupons} = 1 \quad (5.9)$$

which is the value of the variable coupon bond with maturity T_n . Hence Eq. (5.7).

Swaps

Swaps are contracts that exchange a stream of floating rate payments for a stream of fixed rate payments or vice versa. A swap where we receive a stream of fixed rate payments in exchange for floating rate payments is simply a portfolio which is long a fixed coupon bond and short a variable coupon bond. The price of the former at $t = T_0$ is given by Eq. (5.3), while that of the latter is given by Eq. (5.7). The fixed rate that gives the swap initial null value is independent of maturity T and given by

$$k = \frac{1 - P(T_0, T_n)}{\delta \sum_{i=1}^n P(T_0, T_i)} \quad (5.10)$$

Duration and Convexity

Macaulay duration of a bond is a weighted average maturity of its cash flows, where the weights are the present values of said cash flows. E.g., for a fixed rate coupon bond we have (see Eq. 5.3)

$$\text{MacD}(t, T) = \frac{1}{P_c(t, T)} \left[(T - t) P(t, T) + k\delta \sum_{i=I(t)}^n (T_i - t) P(t, T_i) \right] \quad (5.11)$$

Modified duration is defined as (assuming *parallel shifts* in the yield curve)²

$$\text{ModD}(t, T) = -\frac{\partial \ln(P_c(t, T))}{\partial R(t, T)} \quad (5.12)$$

For continuous compounding, Macaulay duration and modified duration are the same (see Eq. 5.1). For periodic compounding, they differ. For a *constant* yield $R(t, \tau) = Y = \text{const.}$ (for all $t < \tau < T$), they are related via (see fn. 1):

$$\text{ModD}(t, T) = \text{MacD}(t, T)/(1 + Y\delta) \quad (5.13)$$

Modified duration is a measure of the relative bond price sensitivity to changes in the interest rates: $\Delta P_c(t, T)/P_c(t, T) \approx -\text{ModD}(t, T) \Delta R(t, T)$ (for parallel shifts $\Delta R(t, \tau) = \Delta R = \text{const.}$, for all $t < \tau < T$). Similarly, dollar duration defined as

$$\text{DD}(t, T) = -\frac{\partial P_c(t, T)}{\partial R(t, T)} = \text{ModD}(t, T) P_c(t, T) \quad (5.14)$$

is a measure of the absolute bond price sensitivity to changes in the interest rates.

Convexity of a bond is defined as (again, assuming parallel shifts)³

$$C(t, T) = -\frac{1}{P_c(t, T)} \frac{\partial^2 P_c(t, T)}{\partial R(t, T)^2} \quad (5.15)$$

²I.e., $\partial R(t, \tau)/\partial R(t, T) = 1$ for all $t < \tau < T$. For nonuniform shifts things get complicated.

³For some literature on various properties of bonds, see, e.g., Baxter and Rennie (1996), Bessembinder and Maxwell (2008), Čerović et al. (2014), Chance and Jordan (1996), Chen et al. (2007), Chen et al. (2010), Christensen (1999), Cole and Young (1995), Fabozzi (2006a, 2012a, b), Fabozzi and Mann (2010), Henderson (2003), Horvath (1998), Hotchkiss and Ronen (2002), Hull (2012), Hull et al. (2005), Jostova et al. (2013), Kakushadze (2015a), Leland and Panos (1997), Litterman and Scheinkman (1991), Macaulay (1938), Martellini et al. (2003), Osborne (2005), Samuelson (1945), Stulz (2010), Tuckman and Serrat (2012).

and corresponds to nonlinear effects in the response of the bond price to interest rate changes:

$$\Delta P_c(t, T)/P_c(t, T) \approx -\text{ModD}(t, T) \Delta R(t, T) + \frac{1}{2} C(t, T) [\Delta R(t, T)]^2 \quad (5.16)$$

5.2 Strategy: Bullets

In a bullet portfolio, all bonds have the same maturity date T thereby targeting a specific segment of the yield curve. The maturity can be picked based on the trader's outlook on the future interest rates: if the interest rates are expected to fall (i.e., the bond prices to rise), then picking a longer maturity would make more sense; if the interest rates are expected to rise (i.e., the bond prices to fall), then a shorter maturity would be more warranted; however, if the trader is uncertain about the future interest rates, a more diversified portfolio (e.g., a barbell/ladder portfolio—see below) is in order (as opposed to a bullet portfolio). Typically, the bonds in a bullet portfolio are purchased over time, which mitigates the interest rate risk to some extent: if the interest rates rise, the later bond purchases will be at higher rates; if the interest rates fall, the earlier bond purchases will have higher yields.⁴

5.3 Strategy: Barbells

In this strategy, all purchased bonds are concentrated in two maturities T_1 (short maturity) and T_2 (long maturity), so this portfolio is a combination of two bullet strategies. This strategy takes advantage of the higher yields from the long-maturity bonds while hedging the interest rate risk with the short-maturity bonds: if the interest rates rise, the long-maturity bonds will lose value, but the proceeds from the short-maturity bonds can be reinvested at higher rates.⁵ The modified duration (call it D) of the barbell strategy is the same as the modified duration (call it D_*) of a bullet strategy with a mid-range maturity (call it T_* , $T_1 < T_* < T_2$). However, the convexity (call it C) of the barbell strategy is higher than the convexity (call it C_*) of this bullet strategy.

⁴For some literature on bullet and barbell (see below) strategies, see, e.g., Fabozzi et al. (2006), Grantier (1988), Jones (1991), Mann and Ramanlal (1997), Pascalau and Poirier (2015), Su and Knowles (2010), Wilner (1996), Yamada (1999).

⁵Flattening/steepening of the yield curve (the spread between the short-term and long-term interest rates decreases/increases) has a positive/negative impact on the value of the portfolio.

Intuitively this can be understood by noting that modified duration scales approximately linearly with maturity, while convexity scales approximately quadratically with maturity. For illustrative purposes and simplicity, let us consider a barbell strategy consisting of w_1 dollars' worth of zero-coupon bonds with short maturity T_1 and w_2 dollars' worth of zero-coupon bonds with long maturity T_2 (each bond has \$1 face value). Furthermore, let us assume continuous compounding and a constant yield Y . We then have

$$D = \frac{\tilde{w}_1 T_1 + \tilde{w}_2 T_2}{\tilde{w}_1 + \tilde{w}_2} \quad (5.17)$$

$$T_* = D_* = D \quad (5.18)$$

$$C = \frac{\tilde{w}_1 T_1^2 + \tilde{w}_2 T_2^2}{\tilde{w}_1 + \tilde{w}_2} \quad (5.19)$$

$$C_* = T_*^2 \quad (5.20)$$

where $\tilde{w}_1 = w_1 \exp(-T_1 Y)$ and $\tilde{w}_2 = w_2 \exp(-T_2 Y)$. Straightforward algebra gives

$$C - C_* = \frac{\tilde{w}_1 \tilde{w}_2}{(\tilde{w}_1 + \tilde{w}_2)^2} (T_2 - T_1)^2 > 0 \quad (5.21)$$

Higher convexity of the barbell portfolio provides a better protection against parallel shifts in the yield curve. However, this comes at the expense of a lower overall yield.

5.4 Strategy: Ladders

A ladder is a bond portfolio with (roughly) equal capital allocations into bonds of n different maturities T_i , $i = 1, \dots, n$ (where the number of rungs n is sizable, e.g., $n = 10$). The maturities are equidistant: $T_{i+1} = T_i + \delta$. This is a duration-targeting strategy,⁶ which maintains an approximately constant duration by selling shorter-maturity bonds as they approach maturity and replacing them with new longer-maturity bonds. A ladder portfolio aims to diversify the interest rate and reinvestment risks⁷ by avoiding exposure to only a few maturities (as in bullets and barbells). It also generates a regular revenue

⁶For some literature on ladder and duration-targeting strategies, see, e.g., Bierwag et al. (1978), Bohlin and Strickland (2004), Cheung et al. (2010), Dyl and Martin (1986), Fridson and Xu (2014), Judd et al. (2011), Langetieg et al. (1990), Leibowitz and Bova (2013), Leibowitz et al. (2014, 2015).

⁷The reinvestment risk is the risk that the proceeds (from coupon payments and/or principal) would be reinvested at a lower rate than the original investment.

stream from the coupons of each bond. The maturity of a ladder portfolio can be defined as the average maturity:

$$T = \frac{1}{n} \sum_{i=1}^n T_i \quad (5.22)$$

The income is higher for higher values of T ; however, so is the interest rate risk.

5.5 Strategy: Bond Immunization

Bond immunization is used in cases such as a predetermined future cash obligation. A simple solution would be to purchase a zero-coupon bond with the required maturity (and desirable/acceptable yield). However, such a bond may not always be available in the market, so a portfolio of bonds with varying maturities must be used instead. Such a portfolio is subject to the interest rate and reinvestment risks. One way to mitigate these risks is to build a portfolio whose duration matches the maturity of the future cash obligation (thereby “immunizing” the bond portfolio against parallel shifts in the yield curve). Consider a portfolio of bonds with 2 different maturities T_1, T_2 and the corresponding durations D_1, D_2 (where “duration” means modified duration). Let: the dollar amounts invested in these bonds be P_1, P_2 ; the total amount to be invested be P ; the desired duration of the portfolio be D (which is related to the maturity T_* of the future cash obligation—see below); and the *constant* yield (which is assumed to be *the same for all bonds*—see below) be Y . Then P is fixed using Y and the amount of the future obligation F :

$$P = F / (1 + Y\delta)^{T_*/\delta} \quad (5.23)$$

where we are assuming periodic compounding and δ is the length of each compounding period (e.g., 1 year).⁸ Then we have:

$$P_1 + P_2 = P \quad (5.24)$$

$$P_1 D_1 + P_2 D_2 = P D \quad (5.25)$$

where

$$D = T_*/(1 + Y\delta) \quad (5.26)$$

⁸For the sake of simplicity, in Eq. (5.23) the number $n = T_*/\delta$ of compounding periods is assumed to be a whole number. Extension to non-integer T_*/δ is straightforward.

With 3 bonds, we can also match the convexity:

$$P_1 + P_2 + P_3 = P \quad (5.27)$$

$$P_1 D_1 + P_2 D_2 + P_3 D_3 = P D \quad (5.28)$$

$$P_1 C_1 + P_2 C_2 + P_3 C_3 = P C \quad (5.29)$$

where C_1, C_2, C_3 are the convexities of the 3 bonds and

$$C = T_*(T_* + \delta)/(1 + Y\delta)^2 \quad (5.30)$$

In practice, the yield curve changes over time, which (among other things) requires that the portfolio be periodically rebalanced. This introduces nontrivial transaction costs, which must also be accounted for. Furthermore, the yields are not the same for all bonds in the portfolio, which introduces additional complexity into the problem.⁹

5.6 Strategy: Dollar-Duration-Neutral Butterfly

This is a zero-cost combination of a long barbell portfolio (with short T_1 and long T_3 maturities) and a short bullet portfolio (with a medium maturity T_2 , where $T_1 < T_2 < T_3$). Let: the dollar amounts invested in the 3 bonds be P_1, P_2, P_3 ; and the corresponding modified durations be D_1, D_2, D_3 . Then zero cost (i.e., dollar-neutrality) and the dollar-duration-neutrality (the latter protects the portfolio from parallel shifts in the yield curve) imply that

$$P_1 + P_3 = P_2 \quad (5.31)$$

$$P_1 D_1 + P_3 D_3 = P_2 D_2 \quad (5.32)$$

This fixes P_1, P_3 via P_2 . While the portfolio is immune to parallel shifts in the yield curve, it is not immune to changes in the slope or the curvature of the yield curve.¹⁰

⁹For some literature on bond immunization, including more sophisticated optimization techniques, see, e.g., Albrecht (1985), Alexander and Resnick (1985), Bierwag (1979), Bodie et al. (1996), Boyle (1978), Christensen and Fabozzi (1985), De La Peña et al. (2017), Fisher and Weil (1971), Fong and Vasicek (1983, 1984), Hürlimann (2002, 2012), Iturricastillo and De La Peña (2010), Khang (1983), Kocherlakota et al. (1988, 1990), Montrucchio and Peccati (1991), Nawalkha and Chambers (1996), Reddington (1952), Reitano (1996), Shiu (1987, 1988), Zheng et al. (2003).

¹⁰For some literature on various butterfly bond strategies, see, e.g., Bedendo et al. (2007), Brooks and Moskowitz (2017), Christiansen and Lund (2005), Fontaine and Nolin (2017), Gibson and Pritsker (2000), Grieves (1999), Heidari and Wu (2003), Martellini et al. (2002).

5.7 Strategy: Fifty-Fifty Butterfly

This is a variation of the standard butterfly. In the above notations for the dollar-duration-neutral butterfly, we have

$$P_1 D_1 = P_3 D_3 = \frac{1}{2} P_2 D_2 \quad (5.33)$$

So, the fifty-fifty butterfly is still dollar-duration-neutral, but it is no longer dollar-neutral (i.e., it is not a zero-cost strategy). Instead, dollar durations of the wings are the same (hence the term “fifty-fifty”). As a result, the strategy is (approximately) neutral to small steepening and flattening of the yield curve, to wit, if the interest rate spread change between the body and the short-maturity wing is equal to the spread change between the long-maturity wing and the body. That is why this strategy is a.k.a. “neutral curve butterfly” (whose cost is non-dollar-neutrality).

5.8 Strategy: Regression-Weighted Butterfly

Empirically, short-term interest rates are sizably more volatile than long-term interest rates.¹¹ Therefore, the interest rate spread change between the body and the short-maturity wing (of the butterfly—see above) can be expected to be greater by some factor—call it β —than the spread change between the long-maturity wing and the body (so, typically $\beta > 1$). This factor can be obtained from historical data via, e.g., running a regression of the spread change between the body and the short-maturity wing over the spread change between the long-maturity wing and the body. Then, instead of Eq. (5.33), we have the following dollar-duration-neutrality and “curve-neutrality” conditions:

$$P_1 D_1 + P_3 D_3 = P_2 D_2 \quad (5.34)$$

$$P_1 D_1 = \beta P_3 D_3 \quad (5.35)$$

¹¹See, e.g., Edwards and Susmel (2003), Joslin and Konchitchki (2018), Mankiw and Summers (1984), Shiller (1979), Sill (1996), Turnovsky (1989).

Strategy: Maturity-Weighted Butterfly

This is a variation of the regression-weighted butterfly, where instead of fixing β in Eq. (5.35) via a regression based on historical data, this coefficient is based on the 3 bond maturities:

$$\beta = \frac{T_2 - T_1}{T_3 - T_2} \quad (5.36)$$

5.9 Strategy: Low-Risk Factor

As in stocks, empirical evidence suggests that lower-risk bonds tend to outperform higher-risk bonds on the risk-adjusted basis (“low-risk anomaly”).¹² One can define “riskiness” of a bond using different metrics, e.g., bond credit rating and maturity. For instance, a long portfolio can be built (see, e.g., Houweling and van Vundert 2017) by taking Investment Grade bonds with credit ratings AAA through A–, and then taking the bottom decile by maturity. Similarly, one can take High Yield bonds with credit ratings BB+ through B–, and then take the bottom decile by maturity.

5.10 Strategy: Value Factor

“Value” for bonds (see, e.g., Correia et al. 2012; Houweling and van Vundert 2017; L’Hoir and Boulhabel 2010) is trickier to define than for stocks. One way is to compare the observed credit spread¹³ to a theoretical prediction therefor. One way to estimate the latter is, e.g., via a linear cross-sectional (across N bonds labeled by $i = 1, \dots, N$) regression (Houweling and van Vundert 2017):

$$S_i = \sum_{r=1}^K \beta_r I_{ir} + \gamma T_i + \epsilon_i \quad (5.37)$$

$$S_i^* = S_i - \epsilon_i \quad (5.38)$$

Here: S_i is the credit spread; I_{ir} is a dummy variable ($I_{ir} = 1$ if the bond labeled by i has credit rating r ; otherwise, $I_{ir} = 0$) for bond credit rating r

¹²For some literature, see, e.g., De Carvalho et al. (2014), Derwall et al. (2009), Frazzini and Pedersen (2014), Houweling and van Vundert (2017), Ilmanen (2011), Ilmanen et al. (2004), Kozhemiakin (2007), Ng and Phelps (2015).

¹³Credit spread is the difference between the bond yield and the risk-free rate.

(which labels K credit ratings present among the N bonds, which can be one of the 21 credit ratings)¹⁴; T_i are bond maturities; β_r, γ are the regression coefficients; ϵ_i are the regression residuals; and S_i^* is the fitted (theoretical) value of the credit spread. The $N \times K$ matrix I_{ir} has no columns with all zeros (so K can be less than 21). Note that by definition, since each bond has one and only one credit rating, we have

$$\sum_{r=1}^K I_{ir} = 1 \quad (5.39)$$

so the intercept is subsumed in I_{ir} (which is why there is no separate regression coefficient for the intercept). Next, value is defined as $V_i = \ln(S_i/S_i^*)$ or $V_i = \epsilon_i/S_i^* = S_i/S_i^* - 1$, and the bonds in the top decile by V_i are selected for the portfolio.

5.11 Strategy: Carry Factor

Carry is defined as the return from the appreciation of the bond value as the bond rolls down the yield curve (see, e.g., Beekhuizen et al. 2016; Koijen et al. 2018)¹⁵:

$$C(t, t + \Delta t, T) = \frac{P(t + \Delta t, T) - P(t, T)}{P(t, T)} \quad (5.40)$$

Here Δt is the period over which carry is computed. A simplification arises if we assume that the entire term structure of the interest rates stays constant, i.e., the yield $R(t, T) = f(T - t)$ is a function of only $T - t$ (i.e., time to maturity). Then, at time $t + \Delta t$ the yield is $R(t + \Delta t, T) = R(t, T - \Delta t)$. So, we have¹⁶

$$\begin{aligned} C(t, t + \Delta t, T) &= \frac{P(t + \Delta t, T)|_{R(t+\Delta t, T)} - P(t, T)|_{R(t, T)}}{P(t, T)|_{R(t, T)}} = \\ &= R(t, T) \Delta t + C_{roll}(t, t + \Delta t, T) \end{aligned} \quad (5.41)$$

¹⁴These credit ratings are AAA, AA+, AA, AA-, A+, A, A-, BBB+, BBB, BBB-, BB+, BB, BB-, B+, B, B-, CCC+, CCC, CCC-, CC, C.

¹⁵Here, for the sake of simplicity, we consider zero-coupon bonds. The end-result below is also valid for coupon bonds.

¹⁶For financed portfolios, $R(t, T)$ in the second line of Eq. (5.41) is replaced by $R(t, T) - r_f$, where r_f is the risk-free rate. However, this overall shift does not affect the actual holdings in the carry strategy below.

where (taking into account the definition of the modified duration, Eq. (5.12))

$$C_{roll}(t, t + \Delta t, T) = \frac{P(t + \Delta t, T)|_{R(t, T - \Delta t)} - P(t + \Delta t, T)|_{R(t, T)}}{P(t, T)|_{R(t, T)}} \approx \\ \approx -\text{ModD}(t, T) [R(t, T - \Delta t) - R(t, T)] \quad (5.42)$$

So, if the term structure of the interest rates is constant, then carry $C(t, t + \Delta t, T)$ receives two contributions: (i) $R(t, T) \Delta t$ from the bond yield; and (ii) $C_{roll}(t, t + \Delta t, T)$ from the bond rolling down the yield curve. A zero-cost strategy can be built, e.g., by buying bonds in the top decile by carry and selling bonds in the bottom decile.

5.12 Strategy: Rolling Down the Yield Curve

The objective of this strategy is to capture the “roll-down” component $C_{roll}(t, t + \Delta t, T)$ of bond yields. These returns are maximized in the steepest segments of the yield curve. Therefore, the trader can, e.g., buy long- or medium-term bonds from such segments and hold them while they are “rolling down the curve”.¹⁷ The bonds must be sold as they approach maturity and the proceeds can be used to buy new long/medium-term bonds from the steepest segment of the yield curve at that time.

5.13 Strategy: Yield Curve Spread (Flatteners and Steepeners)

This strategy consists of buying or selling the yield curve spread.¹⁸ The yield curve spread is defined as the difference between the yields of two bonds of the same issuer with different maturities. If the interest rates are expected to fall, the yield curve is expected to steepen. If the interest rates are expected to rise, the yield curve is expected to flatten. The yield curve spread strategy can be summarized via the following rule:

¹⁷For some literature on the “rolling down the yield curve” strategies, see, e.g., Ang et al. (1998), Bieri and Chincarini (2004, 2005), Dyl and Joehnk (1981), Grieves et al. (1999), Grieves and Marcus (1992), Osteryoung et al. (1981), Pantalone and Platt (1984), Pelaez (1997).

¹⁸For some literature on yield curve spread strategies, the yield curve dynamics and related topics, see, e.g., Bernadell et al. (2005), Boyd and Mercer (2010), Chua et al. (2006), Diebold and Li (2002), Diebold et al. (2006), Dolan (1999), Evans and Marshall (2007), Füss and Nikitina (2011), Jones (1991), Kalem and Inder (2006), Krishnamurthy (2002), Shiller and Modigliani (1979).

$$\text{Rule} = \begin{cases} \text{Flattener: Short spread if interest rates are expected to rise} \\ \text{Steeper: Buy spread if interest rates are expected to fall} \end{cases} \quad (5.43)$$

Shorting the spread amounts to selling shorter-maturity bonds (a.k.a. the front leg) and buying longer-maturity bonds (a.k.a. the back leg). Buying the spread is the opposite trade: buying the front leg and selling the back leg. If the yield curve has parallel shifts, this strategy can generate losses. Matching dollar durations of the front and back legs immunizes the portfolio to small parallel shifts in the yield curve.

5.14 Strategy: CDS Basis Arbitrage

A credit default swap (CDS) is insurance against default on a bond.¹⁹ The CDS price, known as the CDS spread, is a periodic (e.g., annual) premium per dollar of the insured debt. The CDS essentially makes the bond a risk-free instrument. Therefore, the CDS spread should equal the bond yield spread, i.e., the spread between the bond yield and the risk-free rate. The difference between the CDS spread and the bond spread is known as the CDS basis:

$$\text{CDS basis} = \text{CDS spread} - \text{bond spread} \quad (5.44)$$

Negative basis indicates that the bond spread is too high relative to the CDS spread, i.e., the bond is relatively cheap. The CDS arbitrage trade then amounts to buying the bond and insuring it with the CDS²⁰ thereby generating a risk-free profit.²¹

5.15 Strategy: Swap-Spread Arbitrage

This dollar-neutral strategy consists of a long (short) position in an interest rate swap (see Sect. 5.1) and a short (long) position in a Treasury bond (with the constant yield $Y_{Treasury}$) with the same maturity as the swap. A long (short) swap involves receiving (making) fixed rate r_{swap} coupon payments in

¹⁹For some literature on CDS basis arbitrage and related topics, see, e.g., Bai and Collin-Dufresne (2013), Choudhry (2004, 2006, 2007), De Wit (2006), Fontana (2010), Fontana and Scheicher (2016), Kim et al. (2016, 2017), Nashikkar et al. (2011), Rajan et al. (2007), Wang (2014), Zhu (2006).

²⁰Note that the CDS is equivalent to a synthetic short bond position.

²¹In the case of positive basis, theoretically one would enter into the opposite trade, i.e., selling the bond and selling the CDS. However, in practice this would usually imply that the trader already owns the bond and the CDS, i.e., this would amount to unwinding an existing position.

exchange for making (receiving) variable rate coupon payments at LIBOR (the London Interbank Offer Rate) $L(t)$. The short (long) position in the Treasury bond generates (is financed at) the “repo rate” (the discount rate at which the central bank repurchases government securities from commercial banks) $r(t)$ in a margin account. The per-dollar-invested rate $C(t)$ at which this strategy generates P&L is given by

$$C(t) = \pm[C_1 - C_2(t)] \quad (5.45)$$

$$C_1 = r_{\text{swap}} - Y_{\text{Treasury}} \quad (5.46)$$

$$C_2(t) = L(t) - r(t) \quad (5.47)$$

where the plus (minus) sign corresponds to the long (short) swap strategy. The long (short) swap strategy is profitable if LIBOR falls (rises). So, this is a LIBOR bet.²²

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²²For some literature on swap spreads and related topics, see, e.g., Asgharian and Karlsson (2008), Aussenegg et al. (2014), Chen and Selender (1994), Collin-Dufresne and Solnik (2001), Duarte et al. (2006), Dubil (2011), Duffie (1996), Duffie and Singleton (b), Feldhütter and Lando (2008), Fisher (2002), Jermann (2016), Jordan and Jordan (1997), Kambhu (2006), Keane (1996), Klingler and Sundaresan (2016), Kobar et al. (2005), Lang et al. (1998), Liu et al. (2006), Minton (1997).

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6

Indexes

6.1 Generalities

An index is a diversified portfolio of assets combined with some weights. The underlying assets are often stocks, e.g., in indexes such as DJIA, S&P 500, Russell 3000, etc. DJIA weights are based on price, while S&P 500 and Russell 3000 weights are based on market capitalization. Investment vehicles such as index futures, index-based ETFs, etc., allow gaining exposure to a broad index with a single trade.¹

6.2 Strategy: Cash-and-carry Arbitrage

This strategy (a.k.a. “index arbitrage”) aims to exploit price inefficiencies between the index spot² price and index futures price.³ Theoretically, the price of the index futures must equal the spot price accounting for the cost of carry during the life of the futures contract:

¹For some literature on indexes, see, e.g., Antoniou and Holmes (1995), Beneish and Whaley (1996), Bologna and Cavallo (2002), Bos (2000), Chang et al. (1999), Chiang and Wang (2002), Edwards (1988), Frino et al. (2004), Graham and Pirie (1994), Hautcoeur (2006), Illueca and Lafuente (2003), Kenett et al. (2013), Lamoureux and Wansley (1987), Larsen and Resnick (1998), Lo (2016), Schwartz and Laatsch (1991), Spyrou (2005), Yo (2001).

²“Spot” refers to the current value of the index based on the current prices of its constituents. “Cash” refers to the underlying index portfolio. This is common trader lingo.

³See, e.g., Brenner et al. (1989), Bühler and Kempf (1995), Butterworth and Holmes (2010), Chan and Chung (1993), Cornell and French (1983), Dwyer et al. (1996), Fassas (2011), Puttonen (1993), Richie et al. (2008), Yadav and Pope (1990), Yadav and Pope (1994).

$$F^*(t, T) = [S(t) - D(t, T)] \exp(r(T - t)) \quad (6.1)$$

Here: $F^*(t, T)$ is the theoretical (“fair”) price, at time t , of the futures contract with the delivery time T ; $S(t)$ is the spot value at time t ; $D(t, T)$ is the sum of (discounted values of) the dividends paid by the underlying stocks between the time t and delivery; and r is the risk-free rate, which for the sake of simplicity is assumed to be constant from t to delivery.⁴ The basis is defined as

$$B(t, T) = \frac{F(t, T) - F^*(t, T)}{S(t)} \quad (6.2)$$

where $F(t, T)$ is the current price of the futures contract with the delivery time T . If $B(t, T) \neq 0$, more precisely, if $|B(t, T)|$ exceeds the pertinent transaction costs of executing the arbitrage trade, then there is an arbitrage opportunity. If the basis is positive (negative), the futures price is rich (cheap) compared with the spot price, so the arbitrage trade amounts to selling (buying) the futures and buying (selling) the cash (i.e., the index basket).⁵ The position is closed when the basis goes to zero, i.e., the futures price converges to its fair value. Such arbitrage opportunities are short-lived and with the advent of high frequency trading require extremely fast execution. In many cases, the slippage can be prohibitive to execute the trade.⁶

6.3 Strategy: Dispersion Trading in Equity Indexes

This strategy takes long positions on volatilities of the index constituents and a short position on index volatility. It is rooted in an empirical observation that, for the most part,⁷ the implied volatility $\tilde{\sigma}_I$ from index options is sizably higher than the theoretical index volatility σ_I given by

⁴Equation (6.1) further ignores some other pertinent aspects such as taxes, asymmetry of interest rates (for long and short holdings), transaction costs, etc.

⁵Selling the futures poses no issues. However, selling the cash can be problematic with short-selling issues such as hard-to-borrow securities, etc. Continuously maintaining a sizable dollar-neutral book which is long cash and short futures can help circumvent such issues.

⁶In some cases incomplete baskets approximating the index can be executed to reduce the transaction costs, e.g., in market cap weighted indexes, by omitting lower cap (and thus less liquid) stocks. However, such mishedges also increase the risk of losing money on the trade.

⁷But not always—see below. For some literature on index vs. constituent volatilities and dispersion and correlation trading, see, e.g., Carrasco (2007), Deng (2008), Lozovaia and Hizhniakova (2005), Marshall (2008), Marshall (2009), Maze (2012), Meissner (2016), Nelken (2006).

$$\sigma_I^2 = \sum_{i,j=1}^N w_i w_j \sigma_i \sigma_j \rho_{ij} \quad (6.3)$$

where w_i are the weights of the stocks in the index, σ_i are their implied volatilities from single-stock options, and ρ_{ij} is the sample correlation matrix ($\rho_{ii} = 1$)⁸ computed based on a time series of historical returns.⁹ Put differently, the index options are priced higher than the price corresponding to the aforesaid theoretical volatility. So, a basic strategy can be structured as follows. For each stock in the index we have a long position in n_i (near-ATM) single-stock option straddles (whose payoffs are based on the stock prices P_i), and we have a short position in a (near-ATM) option straddle for the index (whose payoff is based on the index level P_I —see below), where

$$n_i = \frac{S_i P_I}{\sum_{i=1}^N S_i P_i} \quad (6.4)$$

Here: S_i is shares outstanding for stock i (we are assuming the index is market cap weighted); and P_I is the index level. With this definition of n_i , we have $P_I = \sum_{i=1}^N n_i P_i$, so the index option straddle payoff matches the individual single-stock option straddle payoffs as closely as possible.¹⁰ All options have approximately 1 month until the expiration, and all positions remain open until the expiration.¹¹

Strategy: Dispersion Trading: Subset Portfolio

For some indexes, some component stocks may not have single-stock options. Often these would be less liquid, lower market cap stocks. They would have to be excluded from the bought portfolio. Reducing the number of bought

⁸Note that the pair-wise correlations ρ_{ij} , $i \neq j$, typically are unstable out-of-sample, which can introduce a sizable error into this computation.

⁹For some pertinent literature, see, e.g., Bakshi and Kapadia (2003a, b), Bakshi et al. (2003), Bollen and Whaley (2004), Branger and Schlag (2004), Coval and Shumway (2001), Dennis and Mayhew (2002), Dennis et al. (2006), Driessen et al. (2009), Gârleanu et al. (2009), Lakonishok et al. (2007).

¹⁰If ATM options are not available for a given stock, OTM options (close to ATM) can be used.

¹¹This strategy can be argued to be a volatility strategy. However, it can also be argued to be correlation trading as the volatility of the portfolio depends on the correlations between its components (see Eq. (6.3)). Thus, when the implied index volatility $\tilde{\sigma}_I$ is higher than the theoretical value σ_I , this can be (arguably) interpreted as the implied average pair-wise correlation being higher than the average pair-wise correlation based on ρ_{ij} . In this regard, at times the index implied volatility can be lower than its theoretical value, so the dispersion strategy that is short index volatility would lose money and the reverse trade might be in order. See, e.g., Deng (2008).

underlying single-stock options is also desirable to reduce transaction costs. Furthermore, the sample correlation matrix ρ_{ij} is singular for a typical lookback period (e.g., daily close-to-close returns, going back 1 year, which is about 252 trading days) as the number of assets is large (500 for S&P 500 and even larger for other indexes). As mentioned above, the pair-wise correlations are unstable out-of-sample, which increases errors in the theoretical value σ_I computed via Eq. (6.3). This can be mitigated as follows.¹²

The singular and unstable correlation matrix can be made nonsingular and more stable by replacing it with a statistical risk model (Kakushadze and Yu 2017). Let $V_i^{(A)}$ be the principal components of ρ_{ij} with the eigenvalues $\lambda^{(A)}$ in the decreasing order, $\lambda^{(1)} > \lambda^{(2)} > \dots > \lambda^{(r)}$, where r is the rank of ρ_{ij} (if $r < N$, the other eigenvalues are null: $\lambda^{(A)} = 0, A > r$). The statistical risk model correlation matrix is given by

$$\psi_{ij} = \xi_i^2 \delta_{ij} + \sum_{A=1}^K \lambda^{(A)} V_i^{(A)} V_j^{(A)} \tag{6.5}$$

$$\xi_i^2 = 1 - \sum_{A=1}^K \lambda^{(A)} [V_i^{(A)}]^2 \tag{6.6}$$

where $K < r$ is the number of risk factors based on the first K principal components that are chosen to explain systematic risk, and ξ_i is the specific (a.k.a. idiosyncratic) risk. The simplest way to fix K is via eRank (effective rank) (Roy and Vetterli 2007)—see Kakushadze and Yu (2017) for details and complete source code for constructing ψ_{ij} and fixing K . So, now we can use ψ_{ij} (instead of ρ_{ij}) to compute the theoretical volatility σ_I :

$$\sigma_I^2 = \sum_{i,j=1}^N w_i w_j \sigma_i \sigma_j \psi_{ij} = \sum_{i=1}^N w_i^2 \sigma_i^2 \xi_i^2 + \sum_{A=1}^K \left[\sum_{i=1}^N \lambda^{(A)} V_i^{(A)} w_i \sigma_i \right]^2 \tag{6.7}$$

The first term on the r.h.s. of Eq. (6.7) is due to the specific risk. The long portfolio then contains only the straddles corresponding to the first N_* single-stock options with the lowest N_* values of $w_i^2 \sigma_i^2 \xi_i^2$. E.g., for S&P 500 we can take $N_* = 100$.

¹²The variation of the dispersion trading strategy we discuss here is similar but not identical to the PCA (principal component analysis) based strategy discussed in Deng (2008), Larsson and Flohr (2011), Su (2006). The statistical risk model construction (see below) is more streamlined.

6.4 Strategy: Intraday Arbitrage Between Index ETFs

This strategy amounts to exploiting short-term mispricings between two ETFs (call them ETF1 and ETF2) on the same underlying index.¹³ It can be summarized as follows:

$$\text{Rule} = \begin{cases} \text{Buy ETF2, short ETF1} & \text{if } P_1^{Bid} \geq P_2^{Ask} \times \kappa \\ \text{Liquidate position} & \text{if } P_2^{Bid} \geq P_1^{Ask} \\ \text{Buy ETF1, short ETF2} & \text{if } P_2^{Bid} \geq P_1^{Ask} \times \kappa \\ \text{Liquidate position} & \text{if } P_1^{Bid} \geq P_2^{Ask} \end{cases} \quad (6.8)$$

Here: κ is a predefined threshold, which is close to 1, e.g., $\kappa = 1.002$ (see, e.g., Marshall et al. 2013); P_1^{Bid} and P_2^{Bid} are the bid prices for ETF1 and ETF2, and P_1^{Ask} and P_2^{Ask} are the ask prices. Marketable “fill or kill” limit orders can be used to execute the trades. Such arbitrage opportunities are ephemeral and require a fast order execution system or else slippage will eat away the profits.

6.5 Strategy: Index Volatility Targeting with Risk-Free Asset

A volatility targeting strategy aims to maintain a constant volatility level, which can be achieved by a periodic (weekly, monthly, etc.) rebalancing between a risky asset—in this case an index—and a riskless asset (e.g., U.S. Treasury bills).¹⁴ If σ is the volatility of the risky asset¹⁵ and the volatility target is σ_* , then the allocation weight for the risky asset is given by¹⁶ $w = \sigma_*/\sigma$, and the allocation weight for the risk-free asset is $1 - w$. To avoid overtrading

¹³E.g., S&P 500 ETFs, SPDR Trust (ticker SPY) and iShares (ticker IVV). See, e.g., Marshall et al. (2013). For some additional literature on ETF arbitrage and related topics, see, e.g., Abreu and Brunnermeier (2002), Ackert and Tian (2000), Ben-David et al. (2012), Brown et al. (2018), Cherry (2004), Dolvin (2009), Garvey and Wu (2009), Hendershott and Moulton (2011), Johnson (2008), Maluf and Albuquerque (2013).

¹⁴For some pertinent literature, see, e.g., Albeverio et al. (2013), Anderson et al. (2014), Cirelli et al. (2017), Cooper (2010), Giese (2012), Khuzwayo and Maré (2014), Kim and Enke (2016), Kirby and Ostadić (2012), Papageorgiou et al. (2017), Perchet et al. (2014), Torricelli (2018), Zakamulin (2014).

¹⁵Usually, this is implied volatility as opposed to historical volatility as the former is considered to be forward-looking. Alternatively, it can be based on various volatility-forecasting techniques.

¹⁶If there is a preset maximum leverage L , then w is capped at L .

and reduce transaction costs, rebalancing (instead of periodically) can be done based, e.g., on a preset threshold κ , say, only if the percentage change $|\Delta w|/w$ since the last rebalancing exceeds κ .

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7

Volatility

7.1 Generalities

Some option trading strategies discussed in Chapter 2 are volatility strategies, in the sense that they make bets on high or low future volatility.¹ There are various ways to make volatility bets, and volatility can be viewed as an asset class of its own. Historical volatility is based on a time series of past returns. In contrast, implied volatility extracted from options is considered a forward-looking measure of volatility.² VIX (CBOE Volatility Index, a.k.a. the “uncertainty index” or the “fear gauge index”)³ and other volatility indexes⁴ and derivatives (options and futures) on volatility indexes such as VIX provide avenues for volatility trading.

7.2 Strategy: VIX Futures Basis Trading

This is essentially a mean-reversion strategy. It is rooted in empirical observations (see, e.g., Mixon 2007; Nossman and Wilhelmsson 2009; Simon and

¹E.g., long (short) straddles bet on increasing (decreasing) volatility.

²See, e.g., Abken and Nandi (1996), Ané and Labidi (2001), Canina and Figlewski (1993), Christensen and Prabhala (1998), Derman and Kani (1994), Dumas et al. (1998), Dupire (1994), Glasserman and Wu (2010), He et al. (2015), Lamoureux and Lastrapes (1993), Mayhew (1995), Skiadopoulos et al. (1999).

³See, e.g., Åijö (2008), Corrado and Miller (2005), Fleming et al. (1995), Maghrebi et al. (2007), Shaikh and Padhi (2015), Siriopoulos and Fassas (2009), Skiadopoulos (2004), Whaley (2000), Whaley (2009).

⁴E.g., RVX (CBOE Russell 2000 Volatility Index), VXEEM (CBOE Emerging Markets ETF Volatility Index), TYVIX (CBOE/CBOT 10-year U.S. Treasury Note Volatility Index), GVZ (CBOE Gold ETF Volatility Index), EUVIX (CBOE/CME FX Euro Volatility Index), VXGOG (CBOE Equity VIX on Google), VVIX (CBOE VIX of VIX Index), etc.

Campanano 2014)⁵ that the VIX futures basis (defined below) has essentially no forecasting power for subsequent VIX changes but has substantial forecasting power for subsequent VIX futures price changes. The VIX futures basis B_{VIX} (for our purposes here) is defined as

$$B_{VIX} = P_{UX1} - P_{VIX} \quad (7.1)$$

$$D = \frac{B_{VIX}}{T} \quad (7.2)$$

Here: P_{UX1} is the price of the first-month contract VIX futures⁶; P_{VIX} is the VIX price; D is the daily roll value; and T is the number of business days until the settlement (which is assumed to be at least 10). Empirically, the futures prices tend to fall for positive basis and rise for negative basis (mean-reversion). So, the strategy amounts to shorting VIX futures when the VIX futures curve is upward-sloping (a.k.a. “contango”, so the basis is positive), and buying VIX futures when the VIX futures curve is downward-sloping (a.k.a. “backwardation”, so the basis is negative). Here is a simple trading rule (see, e.g., Simon and Campanano 2014):

$$\text{Rule} = \begin{cases} \text{Open long UX1 position} & \text{if } D < -0.10 \\ \text{Close long UX1 position} & \text{if } D > -0.05 \\ \text{Open short UX1 position} & \text{if } D > 0.10 \\ \text{Close short UX1 position} & \text{if } D < 0.05 \end{cases} \quad (7.3)$$

A short (long) UX1 position is exposed to a risk of a sudden increase (decrease) in the volatility, which typically occurs during equity market sell-offs (rallies), so this risk can be hedged by, e.g., shorting (buying) mini-S&P 500 futures.⁷ The hedge ratio can be estimated, e.g., based on a historical serial regression of the VIX futures price changes over the front-month mini-S&P 500 futures contract returns.⁸

⁵For some additional literature on VIX futures basis and related topics, see, e.g., Buetow and Henderson (2016), Donniger (2014), Fu et al. (2016), Lee et al. (2017), Zhang et al. (2010), Zhang and Zhu (2006).

⁶UX1 has approximately 1 month to maturity, UX2 has approximately 2 months, etc.

⁷Typically, VIX and the equity markets are anti-correlated.

⁸See, e.g., Simon and Campanano (2014) for details.

7.3 Strategy: Volatility Carry with Two ETNs

VXX is an exchange-traded note (ETN) that tracks VIX via a portfolio of short-maturity (months 1 and 2) VIX futures contracts. To maintain a constant maturity, at the close of each day, a portion of the shorter-maturity futures is sold and replaced with the longer-maturity futures bought with the proceeds. Since the VIX futures curve is in contango most of the time, the longer-maturity futures are priced higher than the shorter-maturity futures, so this rebalancing amounts to a decay in the value of VXX over time, which is known as the roll (or contango) loss. Further, as time passes, the futures converge to the spot (VIX), so VXX loses value so long as the VIX futures curve is in contango. VXZ is yet another ETN that tracks VIX via a portfolio of medium-maturity (months 4 through 7) VIX futures. VXZ also suffers roll loss, but to a lesser degree than VXX as the slope of the VIX futures curve, when in contango, decreases with maturity.⁹ The basic strategy then is to short VXX and buy VXZ with the hedge ratio that can be determined via a serial regression.¹⁰ This strategy is not without risks, however. There can be short-term spikes in VXX (the corresponding spikes in VXZ usually are sizably smaller), which can lead to substantial short-term P&L drawdowns, even if the strategy is overall profitable.

Strategy: Hedging Short VXX with VIX Futures

Instead of using a long position in VXZ to hedge the short position in VXX, one can directly use a basket of, e.g., medium-maturity VIX futures.¹¹ The N VIX futures have some weights w_i . These weights can be fixed in a variety of ways, e.g., by minimizing the tracking error, i.e., by running a serial regression (with the intercept) of VXX returns over the N futures returns. Then we have:

$$w_i = \sigma_X \sum_{j=1}^N C_{ij}^{-1} \sigma_j \rho_j \quad (7.4)$$

⁹For some literature on volatility ETNs and related topics, see, e.g., Alexander and Korovilas (2012), Avellaneda and Papanicolaou (2018), DeLisle et al. (2014), Deng et al. (2012), Eraker and Wu (2014), Gehricke and Zhang (2018), Grasselli and Wagalath (2018), Hancock (2013), Husson and McCann (2011), Liu and Dash (2012), Liu et al. (2018), Moran and Dash (2007).

¹⁰We have $h = \beta = \rho \sigma_X / \sigma_Z$, where: h (known as the optimal hedge ratio) is the number of VXZ to buy for each VXX shorted; β is the coefficient (for the VXZ returns) of the serial regression (with the intercept) of the VXX returns over the VXZ returns; σ_X and σ_Z are the historical volatilities of VXX and VXZ, respectively; and ρ is the pair-wise historical correlation between VXX and VXZ.

¹¹These can have maturities of, e.g., 4 through 7 months (thus mimicking the VXZ composition).

Here: ρ_i is the pair-wise historical correlation between the futures labeled by i and VXX; C_{ij} is the $N \times N$ sample covariance matrix for the N futures ($\sigma_i^2 = C_{ii}$ is the historical variance for the futures labeled by i); and σ_X is the historical volatility of VXX. Some w_i may turn out to be negative. This is not necessarily an issue, but one may wish to impose the bounds $w_i \geq 0$. Further, one may wish the strategy to be dollar-neutral, which would amount to imposing the constraint

$$\sum_{i=1}^N w_i = 1 \quad (7.5)$$

which the optimal hedge ratios (7.4) generally do not satisfy. Also, instead of minimizing the tracking error, one may wish to minimize the variance of the entire portfolio. And so on. The portfolio can be rebalanced monthly or more frequently.

7.4 Strategy: Volatility Risk Premium

Empirical evidence indicates that implied volatility tends to be higher than realized volatility most of the time, which is known as the “volatility risk premium”.¹² Simply put, most of the time options are priced higher than the prices one would expect based on realized volatility, so the idea is to sell volatility. E.g., the trader can sell straddles based on S&P 500 options. As a possible proxy for volatility risk premium, the trader can, e.g., use the difference between VIX at the beginning of the current month and the realized volatility (in %, as VIX is quoted in %) of S&P 500 daily returns since the beginning of the current month. If the spread is positive, the trader sells the straddle. If the volatility spikes (which usually happens if the market sells off), the strategy will lose money. It is profitable in sideways markets.¹³

¹²For some pertinent literature, see, e.g., Bakshi and Kapadia (2003a), Bollerslev et al. (2011), Carr and Wu (2009, 2016), Christensen and Prabhala (1998), Eraker (2009), Ge (2016), Miao et al. (2012), Prokopczuk and Simen (2014), Saretto and Goyal (2009), Todorov (2010).

¹³Also, index options are better suited for this strategy than single-stock options as index options typically have higher volatility risk premia (see Sect. 6.3).

Strategy: Volatility Risk Premium with Gamma Hedging

The ATM straddles in the above strategy are Delta-neutral.¹⁴ So, this is a “Vega play”, i.e., the trader is shorting Vega. If the underlying (S&P 500) moves, the short straddle is no longer Delta-neutral: if the underlying goes up (down), Delta becomes negative (positive). So a variation of this strategy is to use Gamma hedging to keep the strategy close to Delta-neutral, which is achieved by buying (selling) the underlying if it moves up (down). Then this becomes a “Theta play”, i.e., the strategy now aims to capitalize on the Theta-decay of the value of the sold options. So, the price of this is the cost of the Gamma hedging, which reduces the P&L. As the underlying moves more and more away from the strike of the sold put and call options, the Gamma hedge becomes more and more expensive and eventually will exceed the collected option premia, at which point the strategy starts losing money.

7.5 Strategy: Volatility Skew—Long Risk Reversal

OTM put options with the underlying at $S_0 = K + \kappa$ tend to be priced higher than OTM call options with the underlying at $S_0 = K - \kappa$ (here K is the strike price, and $\kappa > 0$ is the distance from the strike). I.e., with all else being equal, the implied volatility for puts is higher than for calls.¹⁵ The long risk reversal strategy (see Sect. 2.12), where the trader buys an OTM call option and sells an OTM put option, captures this skew. However, this is a directional strategy—it loses money if the price of the underlying drops below $K_{put} - C$, where K_{put} is the strike price of the put, and $C > 0$ is the premium of the put minus the premium of the call.

¹⁴Some of the Greeks for options are: $\Theta = \partial V / \partial t$ (Theta), $\Delta = \partial V / \partial S$ (Delta), $\Gamma = \partial^2 V / \partial S^2$ (Gamma), $\nu = \partial V / \partial \sigma$ (Vega). Here: V is the value of the option; t is time; S is the price of the underlying; σ is the implied volatility.

¹⁵For some pertinent literature, see, e.g., Bondarenko (2014), Chambers et al. (2014), Corrado and Su (1997), Damghani and Kos (2013), DeMiguel et al. (2013), Doran and Krieger (2010), Doran et al. (2007), Fengler et al. (2012), Flint and Maré (2017), Jackwerth (2000), Kozhan et al. (2013), Liu et al. (2016), Mixon (2011), Zhang and Xiang (2008).

7.6 Strategy: Volatility Trading with Variance Swaps

One issue with trading volatility using options is the need to (almost continuously) Delta-hedge the position to avoid directional exposure,¹⁶ which practically can be both cumbersome and costly. To avoid the need for Delta-hedging, one can make volatility bets using variance swaps. A variance swap is a derivative contract whose payoff $P(T)$ at maturity T is proportional to the difference between the realized variance $v(T)$ of the underlying and the preset variance strike K :

$$P(T) = N \times (v(T) - K) \quad (7.6)$$

$$v(T) = \frac{F}{T} \sum_{t=1}^T R^2(t) \quad (7.7)$$

$$R(t) = \ln \left[\frac{S(t)}{S(t-1)} \right] \quad (7.8)$$

Here: $t = 0, 1, \dots, T$ labels sample points (e.g., trading days); $S(t)$ is the price of the underlying at time t ; $R(t)$ is the log-return from $t - 1$ to t ; F is the annualization factor (thus, if t labels trading days, then $F = 252$); and N is the “variance notional”, which is preset. Note that in Eq. (7.7) the mean of $R(t)$ over the period $t = 1$ to $t = T$ is not subtracted, hence T in the denominator.¹⁷ Long (short) variance swap is a bet that the future realized volatility will be higher (lower) than the current implied volatility. Long (short) variance swaps can therefore be used instead of, e.g., long (short) straddles to go long (short) volatility. For instance, the dispersion strategy of Sect. 6.3 can be executed by selling a variance swap on an index and buying variance swaps on the index constituents (cf. selling and buying straddles).¹⁸

¹⁶See Sect. “Strategy: Volatility Risk Premium with Gamma Hedging” for a Delta-hedging strategy (a.k.a. “Gamma scalping”).

¹⁷If the mean is subtracted, then the denominator would be $T - 1$ instead.

¹⁸For some literature on variance swaps, see, e.g., Ait-Sahalia et al. (2015), Bernard et al. (2014), Broadie and Jain (2008), Bossu (2006), Carr and Lee (2007), Carr and Lee (2009), Carr et al. (2012), Demeterfi et al. (1999), Elliott et al. (2007), Filipović et al. (2016), Hafner and Wallmeier (2007), Härdle and Silyakova (2010), Jarrow et al. (2013), Konstantinidi and Skiadopoulos (2016), Leontsinis and Alexander (2016), Liverance (2010), Martin (2011), Rujivan and Zhu (2012), Schoutens (2005), Wystup and Zhou (2014), Zhang (2014), Zheng and Kwok (2014).

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8

Foreign Exchange (FX)

8.1 Strategy: Moving Averages with HP Filter

In Sect. 3.12, we discussed a trading strategy for stocks wherein the trading signal is based on 2 intersecting (shorter and longer) moving averages. A similar approach can be applied to FX as well. However, FX spot rate time series tend to be rather noisy, which can lead to false signals based on moving averages. To mitigate this, before computing the moving averages, the higher-frequency noise can first be filtered out, e.g., using the so-called Hodrick–Prescott (HP) filter.¹ Then, the remaining lower-frequency trend component (as opposed to the raw spot rate) can be used to compute the moving averages and generate the trading signal (see, e.g., Harris and Yilmaz 2009). The HP filter is given by:

$$S(t) = S^*(t) + v(t) \quad (8.1)$$

$$g = \sum_{t=1}^T [S(t) - S^*(t)]^2 + \lambda \sum_{t=2}^{T-1} [S^*(t+1) - 2S^*(t) + S^*(t-1)]^2 \quad (8.2)$$

$$g \rightarrow \min \quad (8.3)$$

Here: the objective function g is minimized w.r.t. the set of T values of $S^*(t)$, $t = 1, \dots, T$; $S(t)$ is the FX spot rate at time t ; $S^*(t)$ is the lower-frequency

¹A.k.a. the Whittaker–Henderson method in actuarial sciences. For some pertinent literature, see, e.g., Baxter and King (1999), Bruder et al. (2013), Dao (2014), Ehlgen (1998), Harris and Yilmaz (2009), Harvey and Trimbur (2008), Henderson (1924, 1925, 1938), Hodrick and Prescott (1997), Joseph (1952), Lahmiri (2014), McElroy (2008), Weinert (2007), Whittaker (1923, 1924).

(“regular”) component; $v(t)$ is the higher-frequency (“irregular”) component, which is treated as noise; the first term in Eq. (8.2) minimizes the noise, while the second term (based on the discretized second derivative of $S^*(t)$) penalizes the variation in $S^*(t)$; and λ is the smoothing parameter. There is no “fundamental” method to fix λ . Sometimes (but not always) it is set to $\lambda = 100 \times n^2$, where n is the data frequency measured on an annual basis (see, e.g., Baxter and King (1999) for more detail). So, for monthly data, which is what is usually used in this context, $n = 12$. The estimation period usually spans several years (of monthly data). Once $S^*(t)$ is determined, two moving averages $MA(T_1)$ and $MA(T_2)$, $T_1 < T_2$, are calculated based on $S^*(t)$. Then, as before, $MA(T_1) > MA(T_2)$ is a buy signal, and $MA(T_1) < MA(T_2)$ is a sell signal.

8.2 Strategy: Carry Trade

Pursuant to “Uncovered Interest Rate Parity” (UIRP), excess interest earned in one country compared with another country due to a differential between risk-free interest rates in these countries would be precisely offset by depreciation in the FX rate between their currencies:

$$(1 + r_d) = \frac{E_t(S(t + T))}{S(t)} (1 + r_f) \quad (8.4)$$

Here: r_d is the domestic interest rate; r_f is the foreign interest rate; both r_d and r_f are assumed to be constant over the compounding period T ; $S(t)$ is the spot FX rate at time t , which is the worth of 1 unit of the foreign currency in units of the domestic currency; and $E_t(S(t + T))$ is the future (at time $t + T$) spot FX rate expected at time t .² UIRP does not always hold, giving rise to trading opportunities—which are *not* risk-free arbitrage opportunities (see below). Thus, UIRP implies that high interest rate currencies should depreciate w.r.t. low interest rate currencies, whereas empirically on average the opposite tends to transpire, i.e., such currencies tend to appreciate (somewhat).³ So, the basic

²Thus, 1 USD invested at time t in a risk-free asset in the U.S. would be worth $(1 + r_d)$ USD at time $t + T$. Alternatively, 1 USD would buy $1/S(t)$ JPY at time t , which sum could be invested in a risk-free asset in Japan at time t , which would be worth $(1/S(t)) \times (1 + r_f)$ JPY at time $t + T$, which in turn could be expected to be exchanged for $(E_t(S(t + T))/S(t)) \times (1 + r_f)$ USD at time $t + T$. Requiring that the U.S. and Japan investments yield the same return gives Eq. (8.4).

³This is known as “forward premium/discount anomaly/puzzle” or “Fama puzzle”. For some literature on UIRP and related topics, see, e.g., Anker (1999), Ayuso and Restoy (1996), Bacchetta and van Wincopp (2006, 2010), Baillie and Osterberg (2000), Bekaert et al. (2007), Beyaert et al. (2007), Bilson (1981), Chaboud and Wright (2005), Engel (1996), Fama (1984), Frachot (1996), Froot and Thaler (1990),

carry strategy amounts to writing (i.e., selling) forwards on currencies that are at a forward premium, i.e., the forward FX rate $F(t, T)$ exceeds the spot FX rate $S(t)$, and buying forwards on currencies that are at a forward discount, i.e., the forward FX rate $F(t, T)$ is lower than the spot FX rate $S(t)$.⁴ The forward FX rate is given by⁵

$$F(t, T) = S(t) \frac{1 + r_d}{1 + r_f} \quad (8.5)$$

As mentioned above, the carry strategy⁶ is not without risks: this trade can generate losses if the borrowed (lent) currency suddenly appreciates (depreciates) w.r.t. its counterpart, i.e., it is exposed to the FX rate risk. On the other hand, if we borrow the low interest rate currency with the maturity date T , invest the funds in the high interest rate currency, and hedge this position with a forward contract to exchange the high interest rate currency for the low interest rate currency at maturity T (so we can cover the loan), ignoring the transaction costs (and other subtleties such as taxes, etc.), this is a risk-free position and any gains therefrom would amount to risk-free arbitrage. Hence Eq. (8.5), which is a no-risk-free-arbitrage condition.⁷

Strategy: High-minus-low Carry

The carry strategy discussed above can be applied to individual foreign currencies. It can also be applied cross-sectionally, to multiple foreign currencies. Let $s(t) = \ln(S(t))$ (log spot FX rate) and $f(t, T) = \ln(F(t, T))$ (log forward

Hansen and Hodrick (1980), Harvey (2015), Hodrick (1987), Ilut (2012), Lewis (1995), Lustig and Verdelhan (2007), Mark and Wu (2001), Roll and Yan (2008).

⁴Ignoring transaction costs, this is equivalent to borrowing (lending) low (high) interest rate currencies without hedging the FX rate risk.

⁵This is known as “Covered Interest Rate Parity” (CIRP). Note that, assuming Eq. (8.5) holds (see below), when UIRP (i.e., Eq. 8.4) does not hold, $F(t, T) \neq E_t(S(t + T))$.

⁶For some literature on currency carry trades and related topics, see, e.g., Bakshi and Panayotov (2013), Brunnermeier et al. (2008), Burnside et al. (2007, 2008, 2011), Clarida et al. (2009), Deardorff (1979), Doskov and Swinkels (2015), Hau (2014), Jurek (2014), Lustig et al. (2011, 2014), Olmo and Pilbeam (2009), Ready et al. (2017), Rhee and Chang (1992).

⁷Nonetheless, deviations from CIRP (i.e., Eq. 8.5) do occur, which gives rise to covered interest arbitrage. See, e.g., Akram et al. (2008), Avdjiev et al. (2016), Baba and Packer (2009), Boulos and Swanson (1994), Clinton (1988), Coffey et al. (2009), Cosandier and Lang (1981), Du et al. (2018), Duffie (2017), Frenkel and Levich (1975), Frenkel and Levich (1981), Liao (2016), Mancini-Griffoli and Rinaldo (2011), Popper (1993), Rime et al. (2017).

FX rate). The forward discount $D(t, T)$ is defined as

$$D(t, T) = s(t) - f(t, T) \quad (8.6)$$

Pursuant to CIRP, Eq. (8.5), we have

$$D(t, T) = \ln \left(\frac{1 + r_f}{1 + r_d} \right) \approx r_f - r_d \quad (8.7)$$

For a positive forward discount, we buy a forward (i.e., borrow the domestic currency and invest in the foreign currency), and the higher the forward discount, the more profitable the strategy. For a negative forward discount, we sell a forward (i.e., borrow the foreign currency and invest in the domestic currency), and the lower the forward discount, the more profitable the strategy. So, we can construct a cross-sectional trade (including a zero-cost, i.e., dollar-neutral trade—see, e.g., Lustig et al. 2011) by buying forwards on currencies in some top quantile⁸ by forward discount and selling forwards on currencies in the corresponding bottom quantile. The forwards can, e.g., be one-month forwards.

8.3 Strategy: Dollar Carry Trade

This strategy is based on the average cross-sectional forward discount $\bar{D}(t, T)$ (see, e.g., Lustig et al. 2014) for a basket of N foreign currencies:

$$\bar{D}(t, T) = \frac{1}{N} \sum_{i=1}^N D_i(t, T) \quad (8.8)$$

where $D_i(t, T)$ is the forward discount for the currency labeled by $i = 1, \dots, N$. This strategy then goes long (short), with equal weights, all N foreign currency forwards when $\bar{D}(t, T)$ is positive (negative), where T can be 1, 2, 3, 6, 12 months. Empirical evidence suggests that this strategy relates to the state of the U.S. economy, to wit, when the U.S. economy is weak, the average forward discount tends to be positive.⁹

⁸Unlike stocks, that number in thousands, there is a limited number of currencies to play with. Therefore, one does not necessarily have the luxury of taking top and bottom deciles by forward discount. So, this quantile can be a half, a third, etc., depending on the number of currencies.

⁹See, e.g., Cooper and Priestley (2008), Joslin and Konchitchki (2018), Joslin et al. (2014), Lustig et al. (2014), Stambaugh (1988), Tille et al. (2001).

8.4 Strategy: Momentum and Carry Combo

This is a combination of the momentum strategy (Sect. 8.1)¹⁰ and the carry strategy (Sect. 8.2), or their variations. There is a variety of ways these strategies can be combined (including an equally weighted combo, or some ideas discussed in, e.g., Sects. 3.6 and 4.6). A simple combination is based on minimizing the variance of the combo strategy using the sample covariance matrix of historical returns $R_1(t_s)$ and $R_2(t_s)$ of the two strategies (see, e.g., Olszweski and Zhou 2013). Let (here Var and Cor are serial variance and correlation, respectively)

$$\sigma_1^2 = \text{Var}(R_1(t_s)) \quad (8.9)$$

$$\sigma_2^2 = \text{Var}(R_2(t_s)) \quad (8.10)$$

$$\rho = \text{Cor}(R_1(t_s), R_2(t_s)) \quad (8.11)$$

Then minimizing the historical variance of the combined return $R(t_s)$ fixes the strategy weights w_1 and w_2 :

$$R(t_s) = w_1 R_1(t_s) + w_2 R_2(t_s) \quad (8.12)$$

$$w_1 + w_2 = 1 \quad (8.13)$$

$$\text{Var}(R(t_s)) \rightarrow \min \quad (8.14)$$

$$w_1 = \frac{\sigma_2^2 - \sigma_1\sigma_2\rho}{\sigma_1^2 + \sigma_2^2 - 2\sigma_1\sigma_2\rho} \quad (8.15)$$

$$w_2 = \frac{\sigma_1^2 - \sigma_1\sigma_2\rho}{\sigma_1^2 + \sigma_2^2 - 2\sigma_1\sigma_2\rho} \quad (8.16)$$

8.5 Strategy: FX Triangular Arbitrage

This strategy is based on 3 currency pairs.¹¹ Let these currencies be A, B, and C. Then we have 2 chains: (i) exchange A for B, exchange B for C, and exchange C for A; and (ii) exchange A for C, exchange C for B, and exchange B for A. We will focus on the first chain as the second one is obtained by swapping B for C. Each currency pair has the bid and the ask; e.g., $Bid(A \rightarrow B)$ and $Ask(B \rightarrow$

¹⁰For additional literature on FX momentum strategies and related topics, see, e.g., Accominotti and Chambers (2014), Ahmerkamp and Grant (2013), Burnside et al. (2011), Chiang and Jiang (1995), Grobys et al. (2016), Menkhoff et al. (2012), Okunev and White (2003), Serban (2010).

¹¹Albeit one can also consider more than 3 pairs, which is known as multi-currency arbitrage (see, e.g., Moosa 2003).

A) for the A-B pair. So, the rate at which A is exchanged into B is $Bid(A \rightarrow B)$, while the rate at which B is exchanged into A is $1/Ask(B \rightarrow A)$. Therefore, $Bid(B \rightarrow A) = 1/Ask(B \rightarrow A)$, and $Ask(A \rightarrow B) = 1/Bid(A \rightarrow B)$. In the chain (i) above, the trader starts with A and loops back to A with the overall exchange rate

$$R(A \rightarrow B \rightarrow C \rightarrow A) = Bid(A \rightarrow B) \times Bid(B \rightarrow C) \times \frac{1}{Ask(C \rightarrow A)} \quad (8.17)$$

If this quantity is greater than 1, then the trader makes a profit. Such opportunities are ephemeral, so fast market data and trade execution systems are critical here.¹²

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¹²For some literature on triangular arbitrage and related topics, see, e.g., Aiba and Hatano (2006), Aiba et al. (2002, 2003), Akram et al. (2008), Choi (2011), Cross and Kozyakin (2015), Fenn et al. (2009), Goldstein (1964), Gradojevic et al. (2017), Ito et al. (2012), Moosa (2001), Morisawa (2009), Mwangi and Duncan (2012), Osu (2010).

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9

Commodities

9.1 Strategy: Roll Yields

When commodity futures are in backwardation (contango), i.e., when the term structure of futures prices is downward (upward) sloping, long (short) futures positions on average generate positive returns due to the roll yield. Roll yields come from rebalancing futures positions: when the current long (short) futures contract is about to expire, it is sold (covered) and another futures contract with longer expiration is bought (sold). Let

$$\phi = P_1/P_2 \quad (9.1)$$

where P_1 is the front-month futures price, and P_2 is the second-month futures price. The ratio ϕ is a measure of backwardation ($\phi > 1$) and contango ($\phi < 1$). A zero-cost long-short portfolio can then be built based on ϕ , e.g., by buying commodity futures with higher values of ϕ and selling futures with lower values thereof.¹

¹For some pertinent literature, see, e.g., Anson (1998), Arnott et al. (2014), Erb and Harvey (2006), Fama and French (1987, 1988), Feldman and Till (2006), Fuertes et al. (2015), Gorton et al. (2013), Gorton and Rouwenhorst (2006), Greer (2000), Leung et al. (2016), Ma et al. (1992), Mou (2010), Mouakhar and Roberge (2010), Symeonidis et al. (2012), Taylor (2016), Telser (1958).

9.2 Strategy: Trading Based on Hedging Pressure

This strategy is based on hedgers' and speculators' position data provided (weekly) by the U.S. Commodity Futures Trading Commission (CFTC) in the Commitments of Traders (COT) reports. For each commodity, the "hedging pressure" (HP), separately for hedgers and speculators, is calculated as the number of long contracts divided by the total number of contracts (long plus short). So, HP is between 0 and 1. High (low) hedgers' HP is indicative of contango (backwardation), while high (low) speculators' HP is indicative of backwardation (contango). A zero-cost portfolio can be constructed, e.g., as follows. First, the cross-section of commodities is divided into the upper half and the lower half by the speculators' HP. Then, the upper half commodity futures are bought if they are in the bottom quintile by the hedgers' HP, and the lower half commodity futures are sold if they are in the top quintile by the hedger's HP. Typical formation and holding periods are 6 months.²

9.3 Strategy: Portfolio Diversification with Commodities

Commodity markets typically have a low correlation with equity markets, which can be used to improve performance characteristics of equity portfolios by combining equity and commodity investments. There are different ways to do this. A "passive approach" would amount to buying commodities with a preset portion of the available funds, holding them, and rebalancing the portfolio with some periodicity (e.g., monthly or annually). An "active approach" would amount to a tactical asset allocation approach via increasing/decreasing the exposure to commodities based on an increase/decrease in the Fed discount rate (empirically, commodity returns tend to be sizably correlated with the Fed monetary policy) or some other methodology.³

²For some literature on trading strategies based on such data and related topics, see, e.g., Basu and Miffre (2013), Bessembinder (1992), Carter et al. (1983), Cheng and Xiong (2013), de Roon et al. (2000), Dewally et al. (2013), Fernandez-Perez et al. (2016), Fische et al. (2014), Fuertes et al. (2015), Hirshleifer (1990), Lehecka (2013), Miffre (2012), Switzer and Jiang (2010).

³For some literature on diversification strategies using commodities and related topics, see, e.g., Adams and Glück (2015), Bernardi et al. (2018), Bjornson and Carter (1997), Blitz and Van Vliet (2008), Bodie (1983), Bodie and Rosansky (1980), Chan et al. (2011), Chance (1994), Chong and Miffre (2010), Conover et al. (2010), Creti et al. (2013), Daumas (2017), Draper et al. (2006), Edwards and Park (1996), Elton et al. (1987), Frankel (2006), Gorton and Rouwenhorst (2006), Greer (1978), Greer (2007), Hess et al. (2008), Jensen et al. (2000, 2002), Kaplan and Lummer (1998), Lummer and Siegel (1993), Marshall

9.4 Strategy: Value

This strategy is similar to the value strategy for stocks (see Sect. 3.3). Value for commodities can be defined as, e.g., the ratio (see, e.g., Asness et al. 2013)

$$v = P_5/P_0 \quad (9.2)$$

where P_5 is the spot price 5 years ago,⁴ and P_0 is the current spot price. Then one can build a zero-cost portfolio by, e.g., buying the commodities in the top tercile by value, and selling those in the bottom tercile. The portfolio is rebalanced monthly.

9.5 Strategy: Skewness Premium

This strategy is based on the empirically observed negative correlation between the skewness of historical returns and future expected returns of the commodity futures. The skewness S_i is defined as ($i = 1, \dots, N$ labels different commodities):

$$S_i = \frac{1}{\sigma_i^3 T} \sum_{s=1}^T [R_{is} - \bar{R}_i]^3 \quad (9.3)$$

$$\bar{R}_i = \frac{1}{T} \sum_{s=1}^T R_{is} \quad (9.4)$$

$$\sigma_i^2 = \frac{1}{T-1} \sum_{s=1}^T [R_{is} - \bar{R}_i]^2 \quad (9.5)$$

where R_{is} are the time series of historical returns (with T observations in each time series). A zero-cost strategy can be built by, e.g., buying the commodity futures in the bottom quintile by skewness, and selling the futures in the top quintile.⁵

et al. (2008), Miffre and Rallis (2007), Nguyen and Sercu (2010), Taylor (2004), Vrugt et al. (2007), Wang and Yu (2004), Weiser (2003).

⁴Or the average spot price between 5.5 and 4.5 years ago.

⁵See, e.g., Fernandez-Perez et al. (2018). For some additional pertinent literature, see, e.g., Barberis and Huang (2008), Christie-David and Chaudry (2001), Eastman and Lucey (2008), Gilbert et al. (2006), Junkus (1991), Kumar (2009), Lien (2010), Lien and Wang (2015), Mitton and Vorkink (2007), Stulz (1996), Tversky and Kahneman (1992).

9.6 Strategy: Trading with Pricing Models

Commodity futures term structure is nontrivial. One way to model it is via stochastic processes. Let $S(t)$ be the spot price, and let $X(t) = \ln(S(t))$. Then $X(t)$ can be modeled using, e.g., a mean-reverting Brownian motion (i.e., the Ornstein-Uhlenbeck process [Uhlenbeck and Ornstein 1930])⁶:

$$dX(t) = \kappa [a - X(t)] dt + \sigma dW(t) \quad (9.6)$$

Here the parameters κ (mean-reversion parameter), a (the long-run mean) and σ (log-volatility) are assumed to be constant; and $W(t)$ is a Q-Brownian motion, where Q is a risk-free probability measure.⁷ The standard claim pricing argument (see, e.g., Baxter and Rennie 1996; Hull 2012; Kakushadze 2015) gives for the futures price $F(t, T)$ (which is the price at time t of the futures contract with the delivery date T)

$$F(t, T) = E_t(S(T)) \quad (9.7)$$

$$\ln(F(t, T)) = E_t(X(T)) + \frac{1}{2} V_t(X(T)) \quad (9.8)$$

Here $E_t(\cdot)$ and $V_t(\cdot)$ are the conditional expectation and variance, respectively, at time t . This gives:

$$\begin{aligned} \ln(F(t, T)) &= \exp(-\kappa(T-t)) X(t) + a [1 - \exp(-\kappa(T-t))] + \\ &+ \frac{\sigma^2}{4\kappa} [1 - \exp(-2\kappa(T-t))] \end{aligned} \quad (9.9)$$

The parameters κ , a , σ can be fitted using historical data (e.g., using nonlinear least squares). Then the current market price can be compared to the model price to identify the futures that are rich (sell signal) and cheap (buy signal) compared with the model prediction. Here two cautionary remarks are in order.

⁶This is a one-factor model. More complex models including multifactor models, nonconstant/stochastic volatility models, etc., can be considered instead. For some literature on modeling futures prices via stochastic processes and related topics, see, e.g., Andersen (2010), Bessembinder et al. (1995), Borovkova and Geman (2006), Casassus and Collin-Dufresne (2005), Chaiyapo and Phewchean (2017), Choi et al. (2014), Geman and Roncoroni (2006), Gibson and Schwartz (1990), Hilliard and Reis (1998), Jankowitsch and Nettekoven (2008), Litzenberger and Rabinowitz (1995), Liu and Tang (2011), Milonas (1991), Miltersen and Schwartz (1998), Ng and Pirrong (1994), Nielsen and Schwartz (2004), Paschke and Prokopczuk (2012), Pindyck (2001), Routledge et al. (2000), Schwartz (1997, 1998), Schwartz and Smith (2000).

⁷Note that this model reduces to the Black-Scholes model (Black and Scholes 1973) in the limit $\kappa \rightarrow 0$, $a \rightarrow \infty$, $\kappa a = \text{fixed}$.

First, the model fit could work in-sample but have no predictive power out-of-sample, so the forecasting power needs to be ascertained (see, e.g., Paschke and Prokopczuk 2012). Second, a priori we could write down any reasonable term structure model with desirable qualitative properties (e.g., mean-reversion) and fit the parameters using historical data without any reference to an underlying stochastic dynamics whatsoever, including using, e.g., “black-box” machine learning techniques. So long as the model works out-of-sample, there is no magic bullet here and “fancy” does not equal “better”.

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10

Futures

10.1 Strategy: Hedging Risk with Futures

Exposures to certain risks can be mitigated by hedging with futures. E.g., a grain trader who at time t anticipates that he or she will need to buy (sell) X tons of soy at a later time T can hedge the risk of soy prices increasing (decreasing) between t and T by buying (selling) at time t a futures contract with the delivery date T for the desired amount of soy. This simple strategy can have tweaks and variations.¹

Strategy: Cross-Hedging

Sometimes a futures contract for the asset to be hedged may not be available. In such cases, the trader may be able to hedge using a futures contract for another asset with similar characteristics.² At maturity T , the payoff of the cross-hedged position established at time t (assuming the short futures position

¹For some literature on hedging with futures, see, e.g., Ahmadi et al. (1986), Cheung et al. (1990), Ederington (1979), Géczy et al. (1997), Ghosh (1993), Grant (2016), Hanly et al. (2018), Lebeck (1978), Lien and Tse (2000), Mun (2016), Wolf (1987), Working (1953).

²For some literature on cross-hedging with futures, see, e.g., Anderson and Danthine (1981), Ankirchner et al. (2012), Ankirchner and Heyne (2012), Benet (1990), Blake and Catlett (1984), Blank (1984), Brooks et al. (2007), Chen and Sutcliffe (2007), Dahlgran (2000), DeMaskey (1997), DeMaskey and Pearce (1998), Foster and Whiteman (2002), Franken and Parcell (2003), Hartzog (1982), Lafuente (2013), McEnally and Rice (1979), Mun and Morgan (1997).

with the unit hedge ratio) is given by:

$$S(T) - F(T, T) + F(t, T) = [S_*(T) - F(T, T)] + [S(T) - S_*(T)] + F(t, T) \quad (10.1)$$

Here: the subscript * indicates that the underlying asset of the futures contract is different from the hedged asset; $S(t)$ is the spot price; $F(t, T)$ is the futures price; the first term on the r.h.s. represents the basis risk stemming from the difference at delivery between the futures and the spot prices; and the second term represents the difference twixt the two underlying prices. In practice, the optimal hedge ratio may not be 1 and can be estimated via, e.g., a serial regression or some other method.³

Strategy: Interest Rate Risk Hedging

Fixed-income assets are sensitive to interest rate variations (see Chapter 5) and futures contracts can be used to hedge the interest rate risk. A long (short) hedge position amounts to buying (selling) interest rate futures in order to hedge against an increase (decrease) in the price of the underlying asset, i.e., a decrease (increase) in the interest rates.⁴ The corresponding P&L ($P_L(t, T)$) for the long hedge and $P_S(t, T)$ for the short hedge, assuming the position is established at $t = 0$ with the unit hedge ratio and the maturity is T is given by:

$$P_L(t, T) = B(0, T) - B(t, T) \quad (10.2)$$

$$P_S(t, T) = B(t, T) - B(0, T) \quad (10.3)$$

$$B(t, T) = S(t) - F(t, T) \quad (10.4)$$

where $B(t, T)$ is the futures basis. In practice, the hedge ratio may not be 1. If a hedge is against a bond in the futures delivery basket,⁵ then the conversion

³For various optimal hedge ratio techniques, see, e.g., Baillie and Myers (1991), Brooks and Chong (2001), Brooks et al. (2002), Cecchetti et al. (1988), Davis (2006), Holmes (1996), Lien (1992, 2004), Lien and Luo (1993), Lindahl (1992), Low et al. (2002), Kroner and Sultan (1993), Monoyios (2004), Moosa (2003), Myers (1991).

⁴For some literature on hedging the interest rate risk with futures, see, e.g., Booth et al. (1984), Briys and Solnik (1992), Čerović and Pepić (2011), Clare et al. (2000), Fortin and Khoury (1984), Gay et al. (1983), Hilliard (1984), Hilliard and Jordan (1989), Ho and Saunders (1983), Kolb and Chiang (1982), Lee and Oh (1993), Pepić (2014), Picou (1981), Trainer (1983), Yawitz and Marshall (1985), Yeutter and Dew (1982).

⁵Typically, an interest rate futures contract allows not just one bond but any bond from a predefined array of bonds (with varying maturities, coupons, etc.) to be delivered. Hence the use of the conversion factor

factor model⁶ is commonly used to compute the hedge ratio h_C :

$$h_C = C \frac{M_B}{M_F} \quad (10.5)$$

where M_B is the nominal value of the bond, M_F is the nominal value of the futures, and C is the conversion factor. Unlike the conversion factor model, the modified duration hedge ratio h_D can be used for both deliverable and non-deliverable bonds:

$$h_D = \beta \frac{D_B}{D_F} \quad (10.6)$$

where D_B is the dollar duration⁷ of the bond, D_F is the dollar duration of the futures, and β (which is often set to 1) is the change in the bond yield relative to the change in the futures yield, both taken for a given change in the risk-free rate.⁸

10.2 Strategy: Calendar Spread

A bull (bear) futures spread amounts to buying (selling) a near-month futures and selling (buying) a deferred-month futures. This reduces exposure to the overall market volatility and allows to focus more on the fundamentals. Thus, for commodity futures, for the most part, near-month contracts react to supply and demand more than deferred-month contracts. Therefore, if the trader expects low (high) supply and high (low) demand, then the trader can make a bet with a bull (bear) spread.⁹

(see below) defined as follows (Hull 2012): “The conversion factor for a bond is set equal to the quoted price the bond would have per dollar of principal on the first day of the delivery month on the assumption that the interest rate for all maturities equals 6% per annum (with semiannual compounding).”

⁶The conversion factor model applies only to futures contracts that use conversion factors, such as T-bond and T-note futures.

⁷Recall that the dollar duration equals the price times the modified duration.

⁸The factor β can be estimated based on the historical data. For some literature on interest rate futures hedge ratios and related topics, see, e.g., Chang and Fang (1990), Chen et al. (2005), Daigler and Copper (1998), Falkenstein and Hanweck (1996), Fisher and Weil (1971), Gay and Kolb (1983), Geske and Pieptea (1987), Grieves and Mann (2004), Grieves and Marcus (2005), Hegde (1982), Kolb and Chiang (1981), Kuberek and Pefley (1983), Landes et al. (1985), Pitts (1985), Rendleman (1999), Toevs and Jacob (1986), Viswanath (1993).

⁹For some literature on futures calendar spreads and related topics, see, e.g., Abken (1989), Adrangi et al. (2006), Barrett and Kolb (1995), Bernstein (1990), Bessembinder (1992, 1993), Bessembinder and Chan (1992), Billingsley and Chance (1988), Castelino and Vora (1984), Cole et al. (1999), Daigler

10.3 Strategy: Contrarian Trading (Mean-Reversion)

This strategy is similar to the mean-reversion strategy discussed in Sect. 3.9. Within a given universe of futures labeled by $i = 1, \dots, N$, the “market index” return is calculated as an equally weighted average:

$$R_m = \frac{1}{N} \sum_{i=1}^N R_i \quad (10.7)$$

where R_i are the individual futures returns (typically over the last one week). The capital allocation weights w_i then are given by

$$w_i = -\gamma [R_i - R_m] \quad (10.8)$$

where $\gamma > 0$ is fixed via the normalization condition

$$\sum_{i=1}^N |w_i| = 1 \quad (10.9)$$

Note that the strategy is automatically dollar-neutral. It amounts to buying losers and selling winners w.r.t. the market index (see, e.g., Wang and Yu 2004).¹⁰ As in the case of equities, the simple weighting scheme given by Eq. (10.8) is prone to overinvesting in volatile futures, which can be mitigated by suppressing w_i by $1/\sigma_i$ or $1/\sigma_i^2$, where σ_i are the historical volatilities. The portfolio is rebalanced weekly.

Strategy: Contrarian Trading—Market Activity

Bells and whistles can be added to the above “basic” mean-reversion strategy by incorporating volume and open interest filters. Let V_i be the total volume

(2007), de Roon et al. (1998, 2000), Dunis et al. (2006, 2010), Dutt et al. (1997), Frino and McKenzie (2002), Girma and Paulson (1998), Hou and Nordén (2018), Kawaller et al. (2002), Kim and Leuthold (1997), McComas (2003), Moore et al. (2006), Ng and Pirrong (1994), Perchanok (2012), Perchanok and Kakabadse (2013), Poitras (1990), Ross (2006), Salcedo (2004), Schap (2005), Shimko (1994), Till and Eagleeye (2017), van den Goorbergh (2004).

¹⁰For some additional pertinent literature, see, e.g., Bali and Demirtas (2008), Bessembinder et al. (1995), Bianchi et al. (2015), Chaves and Viswanathan (2016), Fuentes et al. (2015), Irwin et al. (1996), Julio et al. (2013), Leung et al. (2016), Monoyios and Sarno (2002), Rao (2011), Rosales and McMillan (2017), Tse (2017).

for the futures labeled by i over the last week (i.e., the sum of daily volumes over the last week), and V_i' be the total volume over the prior week. Let U_i and U_i' be the analogous quantities for the open interest. Let

$$v_i = \ln(V_i/V_i') \quad (10.10)$$

$$u_i = \ln(U_i/U_i') \quad (10.11)$$

Then the strategy can be built, e.g., by taking the upper half of the futures by the volume factor v_i , taking the lower half of these futures by the open interest factor u_i , and applying the strategy defined by Eq. (10.8) to this subset of the futures.¹¹

10.4 Strategy: Trend Following (Momentum)

Various momentum strategies for futures can be constructed similarly to those for stocks. Here is a simple example (see, e.g., Balta and Kosowski 2013; Moskowitz et al. 2012).¹² Let R_i be the returns for the futures labeled by $i = 1, \dots, N$ over the past period T (which can be measured in, e.g., days, weeks, or months). Then the weights w_i of the trading portfolio are given by

$$w_i = \gamma \frac{\eta_i}{\sigma_i} \quad (10.12)$$

$$\eta_i = \text{sign}(R_i) \quad (10.13)$$

where σ_i are the historical volatilities (computed over the period T or some other period), and $\gamma > 0$ is fixed via the normalization condition

$$\sum_{i=1}^N |w_i| = 1 \quad (10.14)$$

Note that this strategy is equivalent to the optimization strategy (see Sect. 3.18, Eq. 3.85) with a diagonal covariance matrix $C_{ij} = \sigma_i^2 \delta_{ij}$ (i.e., the correlations

¹¹The rationale behind this is that: (i) larger volume changes are likely indicative of greater overreaction (see, e.g., Bloom et al. 1994; Conrad et al. 2013; DeBondt and Thaler 1985; Gervais and Odean 2001; Odean 2002; Statman et al. 2006), so a greater “snap-back” (i.e., mean-reversion) effect can be expected; and (ii) open interest is related to trading by hedgers and is a proxy for market depth (see, e.g., Bessembinder and Seguin 1993), so an increase in open interest is indicative of a deeper market where volume increases have smaller effects on prices as compared with when there is a decrease in open interest.

¹²For some additional pertinent literature, see, e.g., Ahn et al. (2002), Bianchi et al. (2015), Dusak (1973), Fuertes et al. (2010, 2015), Hayes (2011), Kazemi and Li (2009), Miffre and Rallis (2007), Pirrong (2005), Reynald and Tessier (1984), Schneeweis and Gupta (2006), Szakmary et al. (2010).

between different futures are ignored) and the expected returns $E_i = \eta_i \sigma_i$. This is to be contrasted with the expected returns based on the cumulative returns (Eq. 3.2), which in this case equal R_i . One issue with using $E_i = \eta_i \sigma_i$ as opposed to $E_i = R_i$ is that, for small $|R_i|$ (e.g., compared with σ_i), η_i can flip even though the change in R_i is small. This results in an undesirable instability in the strategy. There are ways to mitigate this, e.g., by smoothing via $\eta_i = \tanh(R_i/\kappa)$, where κ is some parameter, e.g., the cross-sectional standard deviation of R_i (see, e.g., Kakushadze 2015). Alternatively, one may simply take $E_i = R_i$ (and further use a non-diagonal C_{ij}). Also, note that the weights defined by Eq. (10.12) are not dollar-neutral. This can be rectified by demeaning them:

$$w_i = \gamma \left[\frac{\eta_i}{\sigma_i} - \frac{1}{N} \sum_{j=1}^N \frac{\eta_j}{\sigma_j} \right] \quad (10.15)$$

One shortcoming of this is that now some futures with $\eta_i > 0$ may be sold, and some futures with $\eta_i < 0$ may be bought. To avoid this, if the number $N_+ = |H_+|$ of the futures with $\eta_i > 0$ is not dramatically different from the number $N_- = |H_-|$ of the futures with $\eta_i < 0$ (here $H_{\pm} = \{i \mid \pm \eta_i > 0\}$), we can take the weights to be

$$w_i = \gamma_+ \frac{\eta_i}{\sigma_i}, \quad i \in H_+ \quad (10.16)$$

$$w_i = \gamma_- \frac{\eta_i}{\sigma_i}, \quad i \in H_- \quad (10.17)$$

So, now we have two parameters γ_{\pm} , which can be fixed to satisfy Eq. (10.14) and the dollar-neutrality condition

$$\sum_{i=1}^N w_i = 0 \quad (10.18)$$

However, if most η_i are positive (negative), i.e., we have skewed returns, then long (short) positions will be well-diversified, while the short (long) positions will not be. This can happen, e.g., if the broad market is rallying (selling off). Equation (10.15) mitigates this to some extent. However, η_i can still be skewed in this case. A simple way to avoid this altogether is to use the demeaned returns \tilde{R}_i instead of R_i , where $\tilde{R}_i = R_i - R_m$, and the “market index” return R_m

is defined by Eq. (10.7).¹³ Then $\eta_i = \text{sign}(\tilde{R}_i)$ are no longer skewed and dollar-neutrality can be achieved as above.¹⁴

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¹³I.e., in this case the momentum, winners and losers are defined w.r.t. the market index, and the so-defined winners are bought, while the losers are sold.

¹⁴Further, instead of using cumulative returns R_t , one can use exponential moving averages (to suppress past contributions—see Chapter 3), the Hodrick-Prescott filter (to remove the noise and identify the trend—see Chapter 8), the Kalman filter (see, e.g., Babbs and Nowman 1999; Benhamou 2016; Bruder et al. 2013; DeMoura et al. 2016; Elliott et al. 2005; Engle and Watson 1987; Harvey 1984; Harvey 1990; Hatemi-J and Roca 2006; Kalman 1960; Lautier and Galli 2004; Levine and Pedersen 2016; Martinelli and Rhoads 2010; Vidyamurthy 2004), or some other time-series filters.

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11

Structured Assets

11.1 Generalities: Collateralized Debt Obligations (CDOs)

A CDO is an asset-backed security (ABS) consisting of a basket of assets such as bonds, credit default swaps, etc. It is divided into multiple tranches, which consist of assets with different credit ratings and interest rates. Each tranche has an attachment point a and a detachment point d . E.g., a 3–8% tranche (for which $a = 3\%$ and $d = 8\%$) means that it begins to lose value when the underlying portfolio loss exceeds 3%; and when the underlying portfolio loss exceeds 8%, the tranche value is completely wiped out.¹ A buyer (long position) of a CDO tranche is a protection seller: in return for receiving periodic premium payments, in the event of a default, the buyer has the obligation to cover the default up to the size of the tranche. A seller (short position) of a CDO tranche is a protection buyer: in return for making periodic premium payments, the seller receives a payment in the event of a default. Synthetic CDOs are “synthesized” through credit derivatives such as CDS (credit default swaps—see Sect. 5.14) on a pool of reference entities (e.g., bonds, loans, names of companies or countries). Reference pools for exchange-traded single-tranche CDOs are CDS indexes such as CDX and iTraxx.²

¹Examples of tranches are (in the decreasing order of default risk and periodic premium payment rate): equity 0–3% tranche; junior mezzanine 3–7% tranche; senior mezzanine 7–10% tranche; senior 10–15% tranche; and super senior 15–30% tranche.

²For some literature on CDOs and related topics, see, e.g., Altman et al. (2005), Amato and Gyntelberg (2005), Amato and Remolona (2003), Andersen and Sidenius (2005), Andersen et al. (2003), Belkin et al. (1998), Bielecki et al. (2011), Bol et al. (2009), Boscher and Ward (2002), Cousin and Laurent (2012), Das (2005), Davis and Lo (2001), Ding and Sherris (2011), Douglas (2007), Duffie (2004), Duffie and

Let $t_i, i = 1, \dots, n$, denote the times at which the periodic premium payments are made.³ Let $H(t)$ denote the set of possible defaults $\ell_\alpha, \alpha = 1, \dots, K$, that can occur by time t , and let $p_\alpha(t)$ denote the corresponding probabilities (which are model-dependent). Here ℓ_α are the dollar amounts of the defaults.⁴ The expected loss $L(t)$ can be computed as

$$L(t) = \sum_{\alpha=1}^K p_\alpha(t) \max(\min(\ell_\alpha, L_d) - L_a, 0) \tag{11.1}$$

where $L_a = a M_{CDO}, L_d = d M_{CDO}$, and M_{CDO} is the CDO notional in dollars.⁵ From the long tranche investor’s perspective, the mark-to-market (MTM) value of the tranche, call it \mathcal{M} , is given by

$$\mathcal{M} = P - C \tag{11.2}$$

$$P = S \sum_{i=1}^n D_i \Delta_i [M_{tr} - L(t_i)] \tag{11.3}$$

$$C = \sum_{i=1}^n D_i [L(t_i) - L(t_{i-1})] \tag{11.4}$$

Here: P is the premium leg; C is the contingent (default) leg; S is the spread; $\Delta_i = t_i - t_{i-1}$; D_i is the risk-free discount factor for the payment date t_i ; and $M_{tr} = L_d - L_a$ is the tranche notional. (Also, t is measured in years, t_0 is the initial time, and $L(t_0) = 0$.) Setting the MTM $\mathcal{M} = 0$ fixes the value of the spread $S = S_*$.

Gârleanu (2001), Duffie and Huang (1996), Duffie and Singleton (1997a, b), Fabozzi (2006a), Finger (1999), Frey et al. (2001), Gibson (2004), Goodman (2002), Goodman and Lucas (2002), Houdain and Guegan (2006), Hull and White (2006, 2010), Jarrow et al. (1997), Jarrow and Turnbull (1995), Jobst (2005, 2006a, b, c, 2007), Laurent and Gregory (2005), Li (2000), Lucas et al. (2006), Meissner (2008), Packer and Zhu (2005), Prince (2005), Schmidt and Ward (2002), Schönbucher (2003), Tavakoli (1998), Vasicek (2015).

³For simplicity, we can also assume that any default payments are also made at those times.

⁴If the notional amount of the defaulted credit labeled by α is M_α , then $\ell_\alpha = M_\alpha(1 - R_\alpha)$, where R_α is the recovery rate (which may be nonzero) of said credit.

⁵Recall that the attachment a and the detachment d are measured in %.

We can further define the “risky duration” \mathcal{D} of the tranche as the first derivative of the MTM w.r.t. the spread:

$$\mathcal{M}(S) = (S - S_*) \sum_{i=1}^n D_i \Delta_i [M_{tr} - L(t_i)] \quad (11.5)$$

$$\mathcal{D} = \partial \mathcal{M} / \partial S = \sum_{i=1}^n D_i \Delta_i [M_{tr} - L(t_i)] \quad (11.6)$$

The risky duration \mathcal{D}_{ix} can also be defined in a similar fashion for a CDS index.

11.2 Strategy: Carry, Equity Tranche—Index Hedging

This strategy amounts to buying the equity (lowest quality) tranche and Delta-hedging it by selling the index. The Delta (i.e., the hedge ratio) is given by⁶

$$\Delta_{ix} = \frac{\mathcal{D}}{\mathcal{D}_{ix}} \quad (11.7)$$

The premiums received from the equity tranche are higher than the premiums paid on the short index position. The risk is the exposure to equity tranche credit events.

11.3 Strategy: Carry, Senior/Mezzanine—Index Hedging

This strategy amounts to *selling* a high quality tranche (e.g., senior/mezzanine) and Delta-hedging the position by *buying* the index.⁷ The Delta is given by Eq. (11.7).

⁶For some literature on CDO tranche hedging and related topics, see, e.g., Arnsdorf and Halperin (2007), Bielecki et al. (2007), Bielecki et al. (2008), Carmona and Crépey (2010), Cont and Minca (2013), Frey and Backhaus (2008, 2010), Giesecke and Weber (2006), Herbrtsson (2008), Houdain and Guegan (2006), Laurent et al. (2011), Walker (2008).

⁷The premiums received from the index are higher than the premiums paid on the short tranche position. So, this trade is “opposite” to the long equity tranche trade hedged with the index.

11.4 Strategy: Carry—Tranche Hedging

This strategy amounts to buying a low quality tranche and Delta-hedging the position by selling a high quality tranche. The hedge ratio is given by:

$$\Delta_{high} = \frac{\mathcal{D}_{low}}{\mathcal{D}_{high}} \quad (11.8)$$

Here \mathcal{D}_{low} and \mathcal{D}_{high} are the risky durations of the low and high quality tranches.

11.5 Strategy: Carry—CDS Hedging

This strategy amounts to buying a low quality tranche and Delta-hedging the position by selling a single-name CDS with lower premium payments than the long tranche (instead of the index or a higher quality tranche). The hedge ratio is given by Eq. (11.7) with \mathcal{D}_{ix} replaced by the risky duration \mathcal{D}_{CDS} of the CDS:

$$\Delta_{CDS} = \frac{\mathcal{D}}{\mathcal{D}_{CDS}} \quad (11.9)$$

11.6 Strategy: CDOs—Curve Trades

As in the case of bonds (see Sect. 5.13), a flattener (steepener) curve trade involves a simultaneous sale (purchase) of a short-term tranche and a purchase (sale) of a long-term tranche. Put differently, with a flattener (steepener), the trader is buying (selling) short-term protection and selling (buying) long-term protection, i.e., the trader expects the spread curve to flatten (steepen), whereby the spread between the long-term and short-term tranches decreases (increases). The carry of the curve trade over the period from time t to time $t + \Delta t$ can be defined as follows

$$C(t, t + \Delta t) = (M_{long} S_{long} - M_{short} S_{short}) \Delta t \quad (11.10)$$

where M_{long} and M_{short} are the long and short tranche notionals, and S_{long} and S_{short} are the corresponding spreads. The trade can be structured to

be dollar-neutral (i.e., notional-neutral, $M_{long} = M_{short}$),⁸ risky duration-neutral ($\mathcal{D}_{long} = \mathcal{D}_{short}$, see Eq. (11.6)), carry-neutral ($M_{long}S_{long} = M_{short}S_{short}$), etc.⁹ The P&L of the strategy is given by (\mathcal{M}_{long} and \mathcal{M}_{short} are the long and short tranche MTMs, see Eq. (11.5)):

$$\text{P\&L} = \mathcal{M}_{long} - \mathcal{M}_{short} \quad (11.11)$$

11.7 Strategy: Mortgage-Backed Security (MBS) Trading

This strategy amounts to buying MBS passthroughs¹⁰ and duration-hedging their interest rate exposure with interest rate swaps. Thus, the main risk of a passthrough MBS is the prepayment risk, whereby homeowners have an option to prepay their mortgages. Homeowners refinance their mortgages as the interest rates drop, which results in negative convexity in the MBS price as a function of the interest rates (e.g., the 5-year swap rate). The hedge ratios are model-dependent and a variety of prepayment models can be constructed. Alternatively one can follow a nonparametric approach whereby using historical data one estimates the first derivative of the passthrough MBS price P w.r.t. the 5-year swap rate R with the constraint that P is a nonincreasing function of R (see, e.g., Duarte et al. 2006),¹¹ employing, e.g., a constrained regression (see, e.g., Ait-Sahalia and Duarte 2003).

⁸In this case, for an upward-sloping curve, a flattener (steepener) has positive (negative) carry as $S_{long} > S_{short}$ ($S_{long} < S_{short}$).

⁹For some literature on curve trades and related topics, see, e.g., Bobey (2010), Burtshell et al. (2009), Choroš-Tomczyk et al. (2016), Crabbe and Fabozzi (2002), Detlefsen and Härdle (2013), Hagenstein et al. (2004), Hamerle et al. (2012), Hull and White (2004), Kakodkar et al. (2006), Koopman et al. (2012), Lin and Shyy (2008), Rajan et al. (2007).

¹⁰An MBS is an asset backed by a pool of mortgages. In a pass-through MBS, which is the most common MBS type, cash flows are passed from debtors to investors through an intermediary.

¹¹For some additional pertinent literature, see, e.g., Ambrose et al. (2004), Biby et al. (2001), Bielecki et al. (2011), Boudoukh et al. (1997), Brazil (1988), Brennan and Schwartz (1985), Carron and Hogan (1988), Chinloy (1989), Davidson et al. (1988), Dechario et al. (2010), Downing et al. (2009), Dunn and McConnell (1981a, b), Dynkin et al. (2001), Fabozzi (2006b), Gabaix et al. (2007), Glaeser and Kallal (1997), Hu (2001), Longstaff (2005), Kau et al. (1995), McConnell and Buser (2011), McKenzie (2002), Nothaft et al. (1995), Passmore et al. (2005), Richard and Roll (1989), Schultz (2016), Schwartz and Torous (1989, 1992), Stanton (1995), Thibodeau and Giliberto (1989), Vickery and Wright (2010).

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12

Convertibles

12.1 Strategy: Convertible Arbitrage

A convertible bond is a hybrid security with an embedded option to convert the bond (a fixed-income instrument) to a preset number (known as the conversion ratio) of the issuer's stock (an equity instrument) when, e.g., the stock price reaches a preset level (known as the conversion price). Empirically, convertibles at the issuance tend to be undervalued relative to their "fair" value.¹ This gives rise to arbitrage opportunities. A convertible arbitrage strategy amounts to buying a convertible bond and simultaneously shorting h units of the underlying stock, where the hedge ratio is given by

$$h = \Delta \times C \quad (12.1)$$

$$\Delta = \partial V / \partial S \quad (12.2)$$

Here: C is the conversion ratio; V is the value of the conversion option (which is model-dependent); S is the underlying stock price; and Δ is the (model-dependent) Delta of the conversion option.² Typically, the position is held for

¹For some literature on convertible bonds and related topics, see, e.g., Agarwal et al. (2011), Ammann et al. (2003, 2010), Batta et al. (2010), Brennan and Schwartz (1988), Brown et al. (2012), Calamos (2003), Chan and Chen (2007), Choi et al. (2009, 2010), De Jong et al. (2011), Duca et al. (2012), Dutordoir et al. (2014), Grundy and Verwijmeren (2016), Henderson (2005), Henderson and Tookes (2012), Ingersoll (1977), Kang and Lee (1996), King (1986), King and Mauer (2014), Korkeamaki and Michael (2013), Lewis et al. (1999), Lewis and Verwijmeren (2011), Loncarski et al. (2006, 2009), Mayers (1998), Ryabkov (2015), Stein (1992), Tsiveriotis and Fernandes (1998), van Marle and Verwijmeren (2017), Zabolotnyuk et al. (2010).

²The Delta itself changes with the stock price S . To account for this, the option Gamma can be used as in section "Strategy: Volatility Risk Premium with Gamma Hedging" in Chapter 7 (Gamma hedging).

6–12 months starting at the issuance date of the convertible and the hedge ratio is updated daily.

12.2 Strategy: Convertible Option-Adjusted Spread

This strategy amounts to simultaneously buying and selling two different convertible bonds of the same issuer. The long position is in a bond with a higher option-adjusted spread (OAS), and the short position is in a bond with a lower OAS (see, e.g., Calamos 2003). Then the trade is profitable if these two spreads converge.

The OAS can be calculated as follows (see, e.g., Hull 2012).³ A straightforward (but not the only)⁴ way to compute the price P_C of the convertible bond is to assume that

$$P_C = P_B + V \quad (12.3)$$

where P_B is the price of the straight bond (without the embedded option), and V is the value of the conversion option, which is a call option. P_B is computed via the standard discounting of the future cash flows of the bond. On the other hand, V depends on the risk-free interest rate curve. At the initial iteration, V is computed (using a pricing model for the call option) assuming the zero-coupon government Treasury curve as the risk-free interest rate curve. This initial iteration $V^{(0)}$ may not coincide with $P_C^{mkt} - P_B$, where P_C^{mkt} is the *market price* of the convertible bond. Then one iteratively (e.g., using the bisection method) *parallel shifts* the input Treasury curve until V computed using the so-shifted curve is such that $V = P_C^{mkt} - P_B$. The curve parallel shift obtained via this iterative procedure is the OAS.

³For some additional literature related to OAS (mostly focused on applications to MBS), see, e.g., Boyarchenko et al. (2014), Brazil (1988), Brown (1999), Cerrato and Djennad (2008), Dong et al. (2009), Hayre (1990), Huang and Kong (2003), Levin and Davidson (2005), Liu and Xu (1998), Stroebel and Taylor (2012), Windas (2007).

⁴For some literature on convertible bond pricing, see, e.g., Ayache et al. (2003), Batten et al. (2014), Brennan and Schwartz (1977), Finnerty and Tu (2017), Ingersoll (1977), Kang and Lee (1996), King (1986), Kwok (2014), McConnell and Schwartz (1986), Milanov et al. (2013), Park et al. (2018), Sörensson (1993), Tsiveriotis and Fernandes (1998), Xiao (2013), Zabolotnyuk et al. (2010).

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13

Tax Arbitrage

13.1 Strategy: Municipal Bond Tax Arbitrage

This strategy is one of the most common and simple forms of tax arbitrage. It amounts to borrowing money and buying tax-exempt municipal bonds.¹ The strategy return is given by

$$R = r_{long} - r_{short} (1 - \tau) \quad (13.1)$$

Here: r_{long} is the interest rate of the bought municipal bonds, r_{short} is the interest rate of the loan, and τ is the corporate tax rate. This strategy is attractive to companies in jurisdictions where tax rules allow them to buy tax-exempt municipal bonds and deduct interest expenses from their taxable income (a.k.a. “tax shield”).

13.2 Strategy: Cross-Border Tax Arbitrage

The U.S. double-taxes corporate income. The corporate income is first taxed at the corporate level. Then, it is taxed again when dividends are received by the shareholders. In some other countries the taxation systems are designed to relieve the tax burden, e.g., by not taxing dividends (as, e.g., in Singapore), or by giving shareholders tax credits attached to dividend payments (as, e.g., in

¹For some literature on municipal bond tax arbitrage and related topics, see, e.g., Ang et al. (2017), Buser and Hess (1986), Chalmers (1998), Erickson et al. (2003), Heaton (1988), Kochin and Parks (1988), Longstaff (2011), Miller (1977), Poterba et al. (1986, 1989), Skelton (1983), Trzcinka (1982), Yawitz et al. (1985).

Australia). In the case where this “dividend imputation” corporate tax system gives the full tax credit to shareholders, it can be schematically described as follows (see, e.g., McDonald 2001)²:

$$\left\{ \begin{array}{l} \text{Corporate tax rate} = \tau_c \\ \text{Cash dividend paid} = D \\ \text{Dividend tax credit} = C = D \frac{\tau_c}{1-\tau_c} \\ \text{Taxable income} = I_t = D + C = \frac{D}{1-\tau_c} \\ \text{Personal tax rate} = \tau_p \\ \text{Personal income tax} = T = I_t \tau_p \\ \text{Dividend income after credit and tax} = I = D + C - T = D \frac{1-\tau_p}{1-\tau_c} \end{array} \right. \quad (13.2)$$

So, if the corporate income is P and the corporation pays all its income after taxes as dividends, i.e., if $D = P(1 - \tau_c)$, then $I = P(1 - \tau_p)$, so there is no double-taxation.³

While in countries with imputation systems domestic investors enjoy tax credits, generally foreign investors do not. If there were no tax credits, the price drop between cum-dividend and ex-dividend⁴ is expected to reflect the dividend. In the presence of tax credits, the drop is expected to be higher: if it fully reflects the tax credit, then it is $D(1 + \kappa)$, where κ is the tax credit rate. (In the above nomenclature, $1 + \kappa = 1/(1 + \tau_c)$). So, a foreign investor is effectively penalized for holding the stock. To avoid this, the foreign investor can sell the stock cum-dividend and buy it back ex-dividend.⁵ Alternatively, the foreign investor can loan the stock to a domestic investor cum-dividend and receive the stock back ex-dividend along with (some preset portion of) the tax credit—assuming no restrictions on such cross-border tax arbitrage. A swap agreement would also achieve the same result.⁶

²However, there can be limitations on the tax credit and other subtleties present depending on the jurisdiction, various circumstances, etc.

³In contrast, in the double-taxation system we would instead have: $D = P(1 - \tau_c)$, $I_t = D$, $T = I_t \tau_p$, $I = I_t - T = P(1 - \tau_c)(1 - \tau_p)$.

⁴Cum-dividend means the stock buyer is entitled to receive a dividend that has been declared but not paid. Ex-dividend means the stock seller is entitled to the dividend, not the buyer.

⁵Assuming transaction costs are not prohibitively high.

⁶For some literature on cross-border tax arbitrage and related topics, see, e.g., Allen and Michaely (1995), Amihud and Murgia (1997), Bellamy (1994), Booth (1987), Booth and Johnston (1984), Brown and Clarke (1993), Bundgaard (2013), Callaghan and Barry (2003), Christoffersen et al. (2003, 2005), Eun and Sabherwal (2003), Green and Rydqvist (1999), Harris et al. (2001), Lakonishok and Vermaelen (1986), Lasfer (1995), Lessambo (2016), McDonald (2001), Monkhouse (1993), Shaviro (2002), Wells (2016), Wood (1997).

Strategy: Cross-Border Tax Arbitrage with Options

Absent a tax credit, there is a theoretical upper bound on the value of an American put option (see, e.g., Hull 2012):

$$V_{put}(K, T) \leq V_{call}(K, T) - S_0 + K + D \quad (13.3)$$

Here: V_{put} (V_{call}) is the price of the put (call) option at time $t = 0$; K is the strike price; S_0 is the stock price at $t = 0$; T is the time to maturity; and D is the present value of the dividends during the life of the option. Put options are optimally exercised ex-dividend. Therefore, in the presence of a tax credit, it is expected that put prices should reflect the tax credit, i.e., they should be higher than in the absence of the tax credit (see, e.g., McDonald 2001). So the foreign investor can sell the stock cum-dividend (at price S_0) and write a deep ITM put option, whose value close to expiration approximately is (here κ is the tax credit rate defined above)

$$V_{put}(K, T) = K - [S_0 - D(1 + \kappa)] \quad (13.4)$$

The P&L, once the put is exercised ex-dividend at the strike price K , is the same as with the stock loan/swap strategy discussed above:

$$\text{P\&L} = S_0 + V_{put}(K, T) - K = D(1 + \kappa) \quad (13.5)$$

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14

Miscellaneous Assets

14.1 Strategy: Inflation Hedging—Inflation Swaps

This strategy amounts to buying (selling) inflation swaps in order to exchange a fixed (floating) rate of inflation for a floating (fixed) rate. Inflation swaps conceptually are similar to interest rate swaps (see section “Swaps” in Chapter 5). A buyer (seller) of an inflation swap is long (short) the inflation and receives the floating (fixed) rate. The buyer has a positive return if the inflation exceeds the expected inflation (i.e., the swap fixed rate, a.k.a. the “breakeven rate”). The fixed rate typically is calculated as the interest rate spread between the Treasury notes/bonds (as applicable) and Treasury Inflation-Protected Securities (TIPS) with the same maturity as that of the swap. The floating rate usually is based on an inflation index such as the Consumer Price Index (CPI). The most common type of inflation swap is the zero-coupon inflation swap (ZC), which has only one cash flow at maturity T (measured in years). This cash flow is the difference between the fixed rate cash flow C_{fixed} and the floating rate cash flow $C_{floating}$. These cash flows, per \$1 notational, are given by:

$$C_{fixed} = (1 + K)^T - 1 \quad (14.1)$$

$$C_{floating} = I(T)/I(0) - 1 \quad (14.2)$$

Here: K is the fixed rate; and $I(t)$ is the CPI value at time t ($t = 0$ is the time at which the swap contract is entered into). Another type of inflation swaps is the year-on-year inflation swap (YoY), which references annual inflation (as opposed to the cumulative inflation referenced by the zero-coupon swap).

Thus, assuming for simplicity annual payments, we have (here $t = 1, \dots, T$ is measured in years)¹:

$$C_{fixed}(t) = K \quad (14.3)$$

$$C_{floating}(t) = I(t)/I(t-1) - 1 \quad (14.4)$$

14.2 Strategy: TIPS-Treasury Arbitrage

This strategy is based on the empirical observation that Treasury bonds tend to be overvalued relative to TIPS² almost all the time (see, e.g., Campbell et al. 2009; Driessen et al. 2017; Fleckenstein 2012; Haubrich et al. 2012). The strategy amounts to selling a Treasury bond (whose price is $P_{Treasury}$, fixed coupon rate is $r_{Treasury}$, and maturity is T) and offsetting this short position with a synthetic portfolio, which precisely replicates the Treasury bond coupon and principal payments, but costs less than the Treasury bond. This synthetic portfolio is constructed by buying TIPS (whose price is P_{TIPS} and maturity T is the same as that of the Treasury bond) with a fixed coupon rate r and n coupon payments at times $t_i, i = 1, \dots, n$ (with $t_n = T$), and simultaneously selling n zero-coupon inflation swaps with maturities t_i , the fixed rate K , and the notionals $N_i = r + \delta_{t_i, T}$ per \$1 of the TIPS principal. The cash flows (per \$1 notional) at $t = t_i$ are given by (as above, $I(t)$ is the CPI value at time t ;

¹For some literature on inflation swaps and related topics, see, e.g., Belgrade and Benhamou (2004), Belgrade et al. (2004), Bouzoubaa and Osseiran (2010), Christensen et al. (2010), Deacon et al. (2004), Fleming and Sporn (2013), Haubrich et al. (2012), Hinnerich (2008), Jarrow and Yildirim (2003), Kenyon (2008), Lioui and Poncet (2005), Martellini et al. (2015), Mercurio (2005), Mercurio and Moreni (2006, 2009), Mercurio and Yildirim (2008).

²TIPS pay semiannual fixed coupons at a fixed rate, but the coupon payments (and principal) are adjusted based on inflation. For some literature on TIPS, inflation-indexed products and related topics, see, e.g., Adrian and Wu (2010), Ang et al. (2008), Bardong and Lehnert (2004), Barnes et al. (2010), Barr and Campbell (1997), Bekaert and Wang (2010), Buraschi and Jiltsov (2005), Campbell et al. (2017), Chen et al. (2010), Chernov and Mueller (2012), Christensen and Gillan (2012), D'Amico et al. (2018), Deacon et al. (2004), Dudley et al. (2009), Evans (1998), Fleckenstein et al. (2017), Fleming and Krishnan (2012), Grishchenko and Huang (2013), Grishchenko et al. (2016), Gürkaynak et al. (2010), Hördahl and Tristani (2012), Hördahl and Tristani (2014), Hunter and Simon (2005), Jacoby and Shiller (2008), Joyce et al. (2010), Kandel et al. (1996), Kitsul and Wright (2013), Kozicki and Tinsley (2012), Mehra (2002), Pennacchi (1991), Pflueger and Viceira (2011), Remolona et al. (1998), Roll (1996, 2004), Sack and Elsasser (2004), Seppälä (2004), Shen (2006), Shen and Corning (2001), Woodward (1990), Yared and Veronesi (1999).

also, time is measured in the units of the (typically, semiannual) compounding periods):

$$C_{TIPS}(t_i) = N_i I(t_i)/I(0) \tag{14.5}$$

$$C_{swap}(t_i) = N_i [(1 + K)^{t_i} - I(t_i)/I(0)] \tag{14.6}$$

$$C_{total}(t_i) = C_{swap}(t_i) + C_{TIPS}(t_i) = N_i (1 + K)^{t_i} \tag{14.7}$$

So, the synthetic portfolio converts the indexed payments from TIPS into fixed payments with the effective coupon rates $r_{eff}(t_i) = r (1 + K)^{t_i}$. These synthetic coupon payments almost replicate the Treasury bond coupons $r_{Treasury}$. The exact matching involves small long or short positions in STRIPS,³ which are given by (see, e.g., Fleckenstein et al. (2013) for details)

$$S(t_i) = D(t_i) \{ [r_{Treasury} - r_{eff}(t_i)] + \delta_{t_i,T} [1 - (1 + K)^{t_i}] \} \tag{14.8}$$

where $D(\tau)$ is the value of the STRIPS with maturity τ at time $t = 0$ (i.e., $D(\tau)$ is a discount factor). In Eq. (14.8) the second term in the curly brackets (which is proportional to $\delta_{t_i,T}$ and is nonzero only for $i = n$, i.e., at maturity T) is included as we must also match the principals at maturity. Note that the STRIPS positions are established at $t = 0$. The net cash flow $C(0)$ at $t = 0$ is given by (note that the net cash flows at $t > 0$ are all null by replication)

$$C(0) = P_{Treasury} - P_{TIPS} - \sum_{i=1}^n S(t_i) \tag{14.9}$$

Empirically $C(0)$ tends to be positive (even after transaction costs). Hence arbitrage.

14.3 Strategy: Weather Risk—Demand Hedging

Various businesses and sectors of the economy can be affected by weather conditions, both directly and indirectly. Weather risk is hedged using weather derivatives. There are no “tradable” weather indexes, so various synthetic indexes have been created. The most common ones are based on temperature. The cooling-

³STRIPS = “Separate Trading of Registered Interest and Principal of Securities”. Essentially, STRIPS are zero-coupon discount bonds.

degree-days (CDD) and heating-degree-days (HDD) measure extreme high temperatures and extreme low temperatures, respectively⁴:

$$I_{CDD} = \sum_{i=1}^n \max(0, T_i - T_{base}) \quad (14.10)$$

$$I_{HDD} = \sum_{i=1}^n \max(0, T_{base} - T_i) \quad (14.11)$$

$$T_i = \frac{T_i^{min} + T_i^{max}}{2} \quad (14.12)$$

Here: $i = 1, \dots, n$ labels days; n is the life of the contract (a week, a month or a season) measured in days; T_i^{min} and T_i^{max} are the minimum and maximum temperatures recorded on the day labeled by i ; and $T_{base} = 65^\circ$ F. Then, the demand risk for heating days can, e.g., be hedged by a short futures position or a long put option position with the hedge ratios given by (here (Cov) Var is serial (co)variance):

$$h_{futures}^{HDD} = \text{Cov}(q_w, I_{HDD}) / \text{Var}(I_{HDD}) \quad (14.13)$$

$$h_{put}^{HDD} = -\text{Cov}(q_w, \max(K - I_{HDD}, 0)) / \text{Var}(\max(K - I_{HDD}, 0)) \quad (14.14)$$

Here: q_w is the portion of the demand affected by weather conditions (as there might be other, exogenous, non-weather-related components to the demand); and K is the strike price. Similarly, the demand risk for cooling days can, e.g.,

⁴For some literature on weather derivatives, weather indexes and related topics, see, e.g., Alaton et al. (2010), Barrieu and El Karoui (2002), Barrieu and Scaillet (2010), Benth (2003), Benth and Saltyte-Benth (2005, 2007), Benth et al. (2007), Bloesch and Gourio (2015), Brocker et al. (2005, 2010), Brody et al. (2002), Campbell and Diebold (2005), Cao and Wei (2000, 2004), Cartea and Figueroa (2005), Chaumont et al. (2006), Chen et al. (2006), Corbally and Dang (2002), Davis (2001), Dischel (1998a, b, 1999), Dorfleitner and Wimmer (2010), Dornier and Queruel (2000), Ederington (1979), Geman (1998), Geman and Leonardi (2005), Ghiulnara and Viegas (2010), Golden et al. (2007), Göncü (2012), Hamisultane (2009), Hanley (1999), Härdle and López Cabrera (2011), Huang et al. (2008), Huault and Rainelli-Weis (2011), Hunter (1999), Jain and Baile (2000), Jewson (2004a, b), Jewson et al. (2005), Jewson and Caballero (2003), Lazo et al. (2011), Lee and Oren (2009), Leggio and Lien (2002), Mraoua (2007), Müller and Grandi (2000), Oetomo and Stevenson (2005), Parnaudeau and Bertrand (2018), Perez-Gonzalez and Yun (2010), Richards et al. (2004), Saltyte-Benth and Benth (2012), Schiller et al. (2010), Svec and Stevenson (2007), Swishchuk and Cui (2013), Tang and Jang (2011), Thornes (2006), Vedenov and Barnett (2004), Wilson (2016), Woodard and Garcia (2008), Yang et al. (2009), Zapranis and Alexandridis (2008), Zapranis and Alexandridis (2009), Zeng (2000).

be hedged by a long futures position or a long call option position with the hedge ratios given by:

$$h_{futures}^{CDD} = \text{Cov}(q_w, I_{CDD}) / \text{Var}(I_{CDD}) \quad (14.15)$$

$$h_{call}^{CDD} = \text{Cov}(q_w, \max(I_{CDD} - K, 0)) / \text{Var}(\max(I_{CDD} - K, 0)) \quad (14.16)$$

14.4 Strategy: Energy—Spark Spread

The spark spread is the difference between the wholesale price of electricity and the price of natural gas required to produce it.⁵ A spark spread can be built by, e.g., taking a short position in electricity futures and a long position in the corresponding number of fuel futures. Such positions are used by electricity producers to hedge against changes in the electricity price or in the cost of fuel, as well as by traders or speculators who want to make a bet on a power plant. The number of fuel futures is determined by the so-called *heat rate* H , which measures the efficiency with which the plant converts fuel into electricity:

$$H = Q_F / Q_E \quad (14.17)$$

Here: Q_F is the amount of fuel used to produce the amount of electricity Q_E ; Q_F is measured in MMBtu; Btu = British thermal unit, which is approximately 1055 Joules; MBtu = 1000 Btu; MMBtu = 1,000,000 Btu; Q_E is measured in Mwh = Megawatt hour; the heat rate H is measured in MMBtu/Mwh. The spark spread is measured in \$/Mwh. So, if the price of electricity is P_E (measured in \$/Mwh) and the price of fuel is P_F (measured in \$/MMBtu), then the spark spread is given by

$$S = P_E - H P_F \quad (14.18)$$

⁵So, the spark spread measures a gross margin of a gas-fired power plant excluding all other costs for operation, maintenance, capital, etc. Also, if the power plant uses fuel other than natural gas, then the corresponding spread has a different name. For coal it is called “dark spread”; for nuclear power it is called “quark spread”; etc. For some literature on energy spreads, energy hedging, and related topics, see, e.g., Benth and Kettler (2010), Benth et al. (2014), Carmona and Durrleman (2003), Cassano and Sick (2013), Deng et al. (2001), Edwards (2009), Elias et al. (2016), Emery and Liu (2002), Fiorenzani (2006), Fusaro and James (2005), Hsu (1998), James (2003), Kaminski (2004), Li and Kleindorfer (2009), Maribu et al. (2007), Martínez and Torró (2018), Wang and Min (2013).

The hedge ratio for the futures is affected by the available futures contract sizes. Thus, an electricity futures contract is $F_E = 736$ Mwh, and a gas futures contract is $F_F = 10,000$ MMBtu. So, the hedge ratio is given by

$$h = H F_E / F_F \quad (14.19)$$

which generally is not a whole number. Therefore, it is (approximately, within the desired precision) represented as a ratio $h \approx N_F / N_E$ with the lowest possible denominator N_E , where N_F and N_E are whole numbers. Then the hedge consists of buying N_F gas futures contracts for every N_E sold electricity futures contracts.

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15

Distressed Assets

15.1 Strategy: Buying and Holding Distressed Debt

Distressed securities are those whose issuers are undergoing financial/operational distress, default or bankruptcy. One definition of distressed debt is if the spread between the yields of Treasury bonds and those of the issuer is greater than some preset number, e.g., 1000 basis points (see, e.g., Harner 2008). A common and simple distressed debt passive trading strategy amounts to buying debt of a distressed company at a steep discount,¹ expecting (hoping) that the company will repay its debt. Typically, a distressed debt portfolio is diversified across industries, entities and debt seniority level. It is anticipated that only a small fraction of the held assets will have positive returns, but those that do, will provide high rates of return (see, e.g., Greenhaus 1991). There are two broad categories of passive distressed debt strategies (see, e.g., Altman and Hotchkiss 2006). First, using various models (see Sect. 15.3) one can attempt to predict whether a company will declare bankruptcy. Second, some strategies focus on assets of companies in default or bankruptcy, a successful reorganization being the driver of returns. Typically, positions are established at key dates, such as at the end of the default month or at the end of the bankruptcy-filing month, with the view of exploiting overreaction in the distressed debt market (see, e.g., Eberhart and Sweeney 1992; Gilson 1995).

¹For some pertinent literature, see, e.g., Altman (1998), Clark and Weinstein (1983), Eberhart et al. (1999), Friewald et al. (2012), Gande et al. (2010), Gilson (2010, 2012), Harner (2011), Hotchkiss and Mooradian (1997), Jiang et al. (2012), Lhabitant (2002), Morse and Shaw (1988), Moyer et al. (2012), Putnam (1991), Quintero (1989), Reiss and Phelps (1991), Volpert (1991).

15.2 Strategy: Active Distressed Investing

This strategy amounts to buying distressed assets with the view (unlike the passive strategy discussed above) to acquire some degree of control of the management and direction of the company. When facing a distress situation, a company has various options in its reorganization process. It can file for bankruptcy protection under Chapter 11 of the U.S. Bankruptcy Code to reorganize. Or it can work directly with its creditors out of Court.² Below are some scenarios for active investing.

Strategy: Planning a Reorganization

An investor can submit a reorganization plan to Court with an objective to obtain participation in the management of the company, attempt to increase its value and generate profits. Plans by significant debt holders tend to be more competitive.

Strategy: Buying Outstanding Debt

This strategy amounts to buying outstanding debt of a distressed firm at a discount with the view that, after reorganization, part of this debt will be converted into the firm's equity thereby giving the investor a certain level of control of the company.

Strategy: Loan-to-own

This strategy amounts to financing (via secured loans) a distressed firm that is not bankrupt with the view that it (i) overcomes the distress situation, avoids bankruptcy and increases its equity value, or (ii) files for Chapter 11 protection and, upon reorganization, the secured loan is converted into the firm's equity with control rights.

15.3 Strategy: Distress Risk Puzzle

Some studies suggest that companies more prone to bankruptcy offer higher returns, which is a form of a risk premium (see, e.g., Chan and Chen 1991; Fama and French 1992, 1996; Vassalou and Xing 2004). However, more recent

²For some literature, see, e.g., Altman and Hotchkiss (2006), Chatterjee et al. (1996), Gilson (1995), Gilson et al. (1990), Jostarndt and Sautner (2010), Levy (1991), Markwardt et al. (2016), Perić (2015), Rosenberg (1992), Swank and Root (1995), Ward and Griepentrog (1993).

studies suggest the opposite, i.e., that such companies do not outperform healthier ones, and that the latter actually offer higher returns. This is the so-called “distress risk puzzle” (see, e.g., George and Hwang 2010; Godfrey and Brooks 2015; Griffin and Lemmon 2002; Ozdagli 2010). So, this strategy amounts to buying the safest companies and selling the riskiest ones. As a proxy, one can use the probability of bankruptcy P_i , $i = 1, \dots, N$ (N is the number of stocks), which can, e.g., be modeled via a logistic regression (see, e.g., Campbell et al. 2008).³ A zero-cost portfolio can be constructed by, e.g., selling the stocks in the top decile by P_i , and buying the stocks in the bottom decile. Typically, the portfolio is rebalanced monthly, but annual rebalancing is also possible (with similar returns).

Strategy: Distress Risk Puzzle—Risk Management

This strategy is a variation of the distress risk puzzle strategy in Sect. 15.3. Empirical studies suggest that zero-cost healthy-minus-distressed (HMD) strategies tend to have a high time-varying market beta, which turns significantly negative following market downturns (usually associated with increased volatility), which can cause large losses if the market bounces abruptly (see, e.g., Garlappi and Yan 2011; O’Doherty 2012; Opp 2017). This is similar to what happens in other factor-based strategies.⁴ To mitigate this, the strategy can be modified as follows (see, e.g., Eisdorfer and Misirli 2015):

$$\text{HMD}_* = \frac{\sigma_{target}}{\widehat{\sigma}} \text{HMD} \quad (15.1)$$

Here: HMD is for the standard HMD strategy in Sect. 15.3; σ_{target} is the level of target volatility (typically, between 10 and 15%, depending on the trader preferences); and $\widehat{\sigma}$ is the estimated realized volatility over the prior year using

³For some literature on models for estimating bankruptcy probabilities, explanatory variables and related topics, see, e.g., Alaminos et al. (2016), Altman (1968, 1993), Aretz and Pope (2013), Beaver (1966), Beaver et al. (2005), Bellovary et al. (2007), Brezigar-Masten and Masten (2012), Callejón et al. (2013), Chaudhuri and De (2011), Chava and Jarrow (2004), Chen et al. (2011), Cultrera and Brédart (2015), Dichev (1998), Duffie et al. (2007), DuJardin (2015), El Kalak and Hudson (2016), Fedorova et al. (2013), Ferreira et al. (2016), Gordini (2014), Griffin and Lemmon (2002), Hensher and Jones (2007), Hillegeist et al. (2004), Jo et al. (1997), Jonsson and Fridson (1996), Korol (2013), Laitinen and Laitinen (2000), McKee and Lensberg (2002), Min et al. (2006), Mossman et al. (1998), Odom and Sharda (1990), Ohlson (1980), Philosophov and Philosophov (2005), Pindado et al. (2008), Podobnik et al. (2010), Ribeiro et al. (2012), Shin and Lee (2002), Shumway (2001), Slowinski and Zopounidis (1995), Tinoco and Wilson (2013), Tsai et al. (2014), Wilson and Sharda (1994), Woodlock and Dangol (2014), Yang et al. (2011), Zhou (2013), Zmijewski (1984).

⁴See, e.g., Barroso and Santa-Clara (2014), Blitz et al. (2011), Daniel and Moskowitz (2016).

daily data. So, 100% of the investment is allocated only if $\hat{\sigma} = \sigma_{target}$, and a lower amount is allocated when $\hat{\sigma} > \sigma_{target}$. When $\hat{\sigma} < \sigma_{target}$, the strategy could be leveraged.⁵

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⁵Or, more simply, 100% of the investment could be allocated without leverage, in which case the prefactor in Eq. (15.1) is $\min(\sigma_{target}/\hat{\sigma}, 1)$ instead.

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16

Real Estate

16.1 Generalities

Real estate, unlike most other financial assets, is tangible. It can be divided into two main groups: commercial (offices, shopping centers, etc.) and residential (houses, apartments, etc.) real estate. There are various ways to get exposure to real estate, e.g., via real estate investment trusts (REITs), which often trade on major exchanges and allow investors to take a liquid stake in real estate.¹ There are several ways to measure a return from a real estate investment. A common and simple way is as follows:

$$R(t_1, t_2) = \frac{P(t_2) + C(t_1, t_2)}{P(t_1)} - 1 \quad (16.1)$$

Here: $R(t_1, t_2)$ is the return of the investment from the beginning of the holding period t_1 to the end of the holding period t_2 ; $P(t_1)$ and $P(t_2)$ are the market values of the property at those times; $C(t_1, t_2)$ is the cash flows received, net of costs.²

¹REITs are in a sense similar to mutual funds as they provide a way for individual investors to acquire ownership in income-generating real estate portfolios.

²For some literature, see, e.g., Block (2011), Eldred (2004), Geltner et al. (1995), Goetzmann and Ibbotson (1990), Hoesli and Lekander (2008), Hudson-Wilson et al. (2005), Larkin et al. (2004), Mazurczak (2011), Pivar (2003), Steinert and Crowe (2001).

16.2 Strategy: Mixed-Asset Diversification with Real Estate

Real estate assets are attractive as a tool for diversification. Empirical studies suggest that their correlation with traditional assets, such as bonds and stocks, is low and remains such even through extreme market events (e.g., financial crises), when the correlations between traditional assets tend to increase. In addition, the correlation tends to be lower at longer time horizons, so long-term investors may improve their portfolio performance in terms of risk-adjusted returns by including real estate assets (see, e.g., Feldman 2003; Geltner et al. 2006; Seiler et al. 1999; Webb et al. 1988). So, a simple strategy amounts to buying and holding real estate assets within a traditional portfolio containing, e.g., bonds, equities, etc. The optimal allocation varies depending on investor preferences (in terms of risk and return) and the horizon (see, e.g., Geltner et al. 1995; Lee and Stevenson 2005; Mueller and Mueller 2003; Rehring 2012), and techniques such as mean-variance optimization or the vector autoregressive model (VAR)³ can be used to calculate the optimal allocation conditional on the time horizon and desired performance characteristics (see, e.g., Fugazza et al. 2007; Hoevenaars et al. 2008; MacKinnon and Al Zaman 2009).

16.3 Strategy: Intra-asset Diversification Within Real Estate

This strategy amounts to diversifying real estate holdings (which can be part of a larger portfolio as in Sect. 16.2). Real estate assets can be diversified by geographic area, type of property, size, proximity to a metropolitan area, economic region, etc. (see, e.g., Eichholtz et al. 1995; Hartzell et al. 1986; Hartzell et al. 1987; Hudson-Wilson 1990; Seiler et al. 1999; Viezer 2000). Various standard portfolio construction techniques (such as those mentioned in Sect. 16.2) can be applied to determine allocations.

Strategy: Property Type Diversification

This strategy amounts to investing in real estate assets of different types, e.g., apartments, offices, industrial properties (which include manufacturing buildings and property), shopping centers, etc. Empirical studies suggest that

³For some literature on the VAR approach, see, e.g., Barberis (2000), Campbell (1991), Campbell et al. (2003), Campbell and Viceira (2004, 2005), Kandel and Stambaugh (1987), Sørensen and Trolle (2005).

property type diversification can be beneficial for non-systematic risk reduction after taking into account transaction costs (see, e.g., Firstenberg et al. 1988; Grissom et al. 1987; Miles and McCue 1984; Mueller and Laposa 1995).

Strategy: Economic Diversification

This strategy amounts to diversifying real estate investments by different regions divided according to economic characteristics such as the main economic activity, employment statistics, average income, etc. Empirical studies suggest that such diversification can reduce non-systematic risk and transaction costs (see, e.g., Hartzell et al. 1987; Malizia and Simons 1991; Mueller 1993).

Strategy: Property Type and Geographic Diversification

This strategy combines diversification based on more than one attribute, e.g., property type and region. Thus, if we consider four property types, to wit, office, retail, industrial and residential, and four U.S. regions, to wit, East, Midwest, South, and West, we can diversify across the resultant 16 groups (see, e.g., Viezer 2000).⁴

16.4 Strategy: Real Estate Momentum—Regional Approach

This strategy amounts to buying real estate properties based on their past returns. Empirical evidence suggests that there is a momentum effect across the U.S. metropolitan statistical areas (MSAs), i.e., areas with higher (lower) past returns tend to continue to deliver higher (lower) returns in the future (see, e.g., Beracha and Downs 2015; Beracha and Skiba 2011). In some cases, a zero-cost strategy can be constructed, e.g., by using alternative real estate vehicles such as REITs, and futures and options on U.S. housing indices based on different geographical areas.⁵

⁴For some additional pertinent literature, see, e.g., De Wit (2010), Ertugrul and Giambona (2011), Gatzlaff and Tirtiroglu (1995), Hartzell et al. (2007), Hastings and Nordby (2007), Ross and Zisler (1991), Seiler et al. (1999), Worzala and Newell (1997).

⁵For some literature on real estate momentum strategies (including using REITs and other investment vehicles mentioned above) and related topics, see, e.g., Abraham and Hendershott (1993, 1996), Anglin et al. (2003), Buttner et al. (2005), Caplin and Leahy (2011), Capozza et al. (2004), Case and Shiller (1987, 1989, 1990), Chan et al. (1990), Chan et al. (1998), Chen et al. (1998), Cho (1996), Chui et al. (2003a, b),

16.5 Strategy: Inflation Hedging with Real Estate

Empirical studies suggest a strong relationship between the real estate returns and inflation rate. Therefore, real estate can be used as a hedge against inflation. Further, empirically, some property types (e.g., commercial real estate, which tends to adjust faster to inflationary price increases) appear to provide a better hedge than others, albeit this can depend on various aspects such as the sample, market, etc.⁶

16.6 Strategy: Fix-and-flip

This is a short-term real estate investment strategy. It amounts to purchasing a property, which typically is in a distressed condition and requires renovations, at a (substantial) discount below market prices. The investor renovates the property and resells it at a price high enough to cover the renovation costs and make a profit.⁷

Cooper et al. (1999), Derwall et al. (2009), de Wit and van der Klaauw (2013), Genesove and Han (2012), Genesove and Mayer (1997, 2001), Goebel et al. (2013), Graff et al. (1999), Graff and Young (1997), Gupta and Miller (2012), Guren (2014), Haurin and Gill (2002), Haurin et al. (2010), Head et al. (2014), Kallberg et al. (2000), Kang and Gardner (1989), Karolyi and Sanders (1998), Knight (2002), Krainer (2001), Kuhle and Alvayay (2000), Lee (2010), Levitt and Syverson (2008), Li and Wang (1995), Lin and Yung (2004), Liu and Mei (1992), Malpezzi (1999), Meen (2002), Mei and Gao (1995), Mei and Liao (1998), Moss et al. (2015), Nelling and Gyourko (1998), Novy-Marx (2009), Ortalo-Magné and Rady (2006), Piazzesi and Schneider (2009), Peterson and Hsieh (1997), Poterba and Sinai (2008), Smith and Shulman (1976), Stein (1995), Stevenson (2001, 2002), Taylor (1999), Titman and Warga (1986), Wheaton (1990), Yavas and Yang (1995), Young and Graff (1996).

⁶For some pertinent literature, see, e.g., Bond and Seiler (1998), Fama and Schwert (1977), Gunasekarage et al. (2008), Hamelink and Hoesli (1996), Hartzell et al. (1987), Le Moigne and Viveiros (2008), Mauer and Sebastian (2002), Miles and Mahoney (1997), Newell (1996), Sing and Low (2000), Wurtzbech et al. (1991).

⁷For some pertinent literature, see, e.g., Anacker (2009), Anacker and Schintler (2015), Bayer et al. (2015), Chinco and Mayer (2012), Corbett (2006), Depken et al. (2009, 2011), Fu and Qian (2014), Hagopian (1999), Kemp (2007), Leung and Tse (2013), Montelongo and Chang (2008), Villani and Davis (2006).

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17

Cash

17.1 Generalities

Cash is an asset, albeit at times its function as an asset might be overlooked or taken for granted. As an asset, cash can be used in a variety of ways, e.g., (i) as a *risk management tool*, as it can help mitigate drawdowns and volatility; (ii) as an *opportunity management tool*, as it allows to take advantage of specific or unusual situations; and (iii) as a *liquidity management tool* in unexpected situations that require liquid funds. There are several ways to include liquid funds in a portfolio, e.g., via U.S. Treasury bills, bank deposit certificates (CDs), commercial paper, banker's acceptances, eurodollars, and repurchase agreements (a.k.a. repos), etc.¹

17.2 Strategy: Money Laundering—The Dark Side of Cash

Money laundering, broadly, is an activity wherein cash is used as a vehicle to transform illegal profits into legitimate-appearing assets. There are three main steps in a money laundering process. The first and the riskiest step is the *placement*, whereby illegal funds are introduced into the legal economy via fraudulent means, e.g., by dividing funds into small amounts and depositing them into multiple bank accounts thereby avoiding detection. The second step, *layering*, involves moving the money around between different accounts and

¹For some literature, see, e.g., Cook and LaRoche (1993), Cook and Rowe (1986), Damiani (2012), Duchin (2010), Goodfriend (2011), Schaefer (1990), Summers (1980), Ysmailov (2017).

even countries thereby creating complexity and separating the money from its source by several degrees. The third step is *integration*, whereby money launderers get back the money via legitimate-looking sources, e.g., cash-intensive businesses such as bars and restaurants, car washes, hotels (at least in some countries), gambling establishments, parking garages, etc.²

17.3 Strategy: Liquidity Management

From a portfolio management perspective, this strategy amounts to optimally defining the amount of cash to be held in the portfolio to meet liquidity demands generated by unforeseen events.³ Cash provides immediate liquidity, whereas other assets would have to be liquidated first, which can be associated with substantial transaction costs, especially if liquidation is abrupt.⁴ From a corporate perspective, holding cash can be a precautionary measure aimed at avoiding cash flow shortfalls that can yield, inter alia, loss of investment opportunities, financial distress, etc.⁵

17.4 Strategy: Repurchase Agreement (REPO)

A repurchase agreement (REPO) is a cash-equivalent asset that provides immediate liquidity at a preset interest rate for a specific period of time in exchange for another asset used as a collateral. A reverse repurchase agreement is the opposite. So, a REPO strategy amounts to borrowing (lending) cash with

²For some literature, see, e.g., Ardizzi et al. (2014), Cox (2015), Gilmour and Ridley (2015), Hopton (1999), John and Brigitte (2009), Kumar (2012), Levi and Reuter (2006), Schneider and Windischbauer (2008), Seymour (2008), Soudijn (2016), Walker (1999), Wright et al. (2017).

³Note that this is not necessarily the same reason for holding cash as that behind Kelly strategies. For some pertinent literature, see, e.g., Browne (2000), Cover (1984), Davis and Lleo (2012), Hsieh and Barmish (2015), Hsieh et al. (2016), Kelly (1956), Laureti et al. (2010), Lo et al. (2017), Maslov and Zhang (1998), Nekrasov (2014), Rising and Wyner (2012), Samuelson (1971), Thorp (2006), Thorp and Kassouf (1967).

⁴For some literature, see, e.g., Agapova (2011b), Aragon et al. (2017), Cao et al. (2013), Chernenko and Sunderam (2016), Connor and Leland (1995), Jiang et al. (2017), Kruttli et al. (2018), Leland and Connor (1995), Simutin (2014), Yan (2006).

⁵For some literature on corporate aspects of liquidity management and related topics, see, e.g., Acharya et al. (2007), Almeida et al. (2005), Azmat and Iqbal (2017), Chidambaram et al. (2001), Disatnik et al. (2014), Froot et al. (1993), Han and Qiu (2007), Opler et al. (1999), Sher (2014).

interest in exchange for securities with the commitment of repurchasing them from (reselling them to) the counterparty. This type of a transaction typically spans from 1 day to 6 months.⁶

17.5 Strategy: Pawnbroking

REPOs are in some sense similar to much more ancient pawnbroking strategies. A pawnbroker extends a secured cash loan with pre-agreed interest and period (which can sometimes be extended). The loan is secured with a collateral, which is some valuable item(s), such as jewelry, electronics, vehicles, rare books or musical instruments, etc. If the loan is not repaid with interest as agreed, then the collateral is forfeited by the borrower and the pawnbroker can keep it or sell it. The amount of loan typically is at a significant discount to the appraised value of the collateral.⁷

17.6 Strategy: Loan Sharking

Unlike pawnbroking, loan sharking in many jurisdictions is illegal. Loan sharking consists of offering a loan at excessively high interest rates. Such a loan is not necessarily secured by a collateral. Instead, a loan shark can sometimes resort to blackmail and/or violence to enforce the terms of a loan (see, e.g., Aldohni 2013).

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⁶See, e.g., Adrian et al. (2013), Bowsher (1979), Duffie (1996), Garbade (2004), Gorton and Metrick (2012), Happ (1986), Kraenzlin (2007), Lumpkin (1987), Ruchin (2011), Schatz (2012), Simmons (1954), Sollinger (1994), Zhang et al. (2018).

⁷In Sect. 9 we discussed trading strategies based on commodity futures. Pawnbrokers, among other things, trade physical commodities such as silver and gold. For some literature on pawnbroking and related topics, see, e.g., Bos et al. (2012), Bouman and Houtman (1988), Caskey (1991), D'Este (2014), Fass and Francis (2004), Maaravi and Levy (2017), McCants (2007), Shackman and Tenney (2006), Zhou et al. (2016).

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18

Cryptocurrencies

18.1 Generalities

Cryptocurrencies, such as Bitcoin (BTC), Ethereum (ETH), etc., unlike traditional fiat currencies (USD, EUR, etc.), are decentralized digital currencies based on open-source peer-to-peer (P2P) internet protocols. Cryptocurrencies such as BTC and ETH use the blockchain technology (Nakamoto 2008).¹ Total market capitalization of cryptocurrencies is measured in hundreds of billions of dollars.² Many investors are attracted to cryptocurrencies as speculative buy-and-hold assets. Thus, some view them as diversifiers due to their low correlation with traditional assets. Others perceive them as the future of money. Some investors simply want to make a quick buck on a speculative bubble. Etc.³ Be it as it may, unlike, e.g., stocks, there are no evident “fundamentals” for cryptoassets based on which one could build “fundamental” trading

¹Blockchain is a distributed ledger, which keeps a record of all transactions. It is a sequential chain of blocks, which are linked using cryptography and time-stamping, containing transaction records. No block can be altered retroactively without altering all subsequent blocks, which renders blockchain resistant to data modification by its very design. For a blockchain maintained by a large network as a distributed ledger continuously updated on a large number of systems simultaneously, collusion of the network majority would be required for a nefarious modification of blockchain.

²Cryptocurrencies are highly volatile, so their market cap has substantial time variability.

³For some pertinent literature, see, e.g., Baek and Elbeck (2014), Bariviera et al. (2017), Bouoiyour et al. (2015), Bouoiyour et al. (2016), Bouri et al. (2017a), Bouri et al. (2017b), Brandvold et al. (2015), Brière et al. (2015), Cheah and Fry (2015), Cheung et al. (2015), Ciaian et al. (2015), Donier and Bouchaud (2015), Dowd and Hutchinson (2015), Dyhrberg (2015), Dyhrberg (2016), Eisl et al. (2015), Fry and Cheah (2016), Gajardo et al. (2018), Garcia and Schweitzer (2015), Garcia et al. (2014), Harvey (2014, 2016), Kim et al. (2016), Kristoufek (2015), Lee et al. (2018), Liew et al. (2018), Ortisi (2016), Van Alstyne (2014), Wang and Vergne (2017), White (2015).

strategies (e.g., value-based strategies). So, cryptocurrency trading strategies tend to rely on trend data mining via machine learning techniques.

18.2 Strategy: Artificial Neural Network (ANN)

This strategy uses ANN to forecast short-term movements of BTC based on input technical indicators. In ANN we have an input layer, an output layer, and some number of hidden layers. So, in this strategy the input layer is built using technical indicators.⁴ E.g., we can use (exponential) moving averages ((E)MAs), (exponential) moving standard deviations ((E)MSDs), relative strength index (RSI),⁵ etc. More concretely, we can construct the input layer as follows (see, e.g., Nakano et al. 2018). Let $P(t)$ be the BTC price at time t , where $t = 1, 2, \dots$ is measured in some units (e.g., 15-minute intervals; also, $t = 1$ is the most recent time). Let:

$$R(t) = \frac{P(t)}{P(t+1)} - 1 \quad (18.1)$$

$$\tilde{R}(t, T_1) = R(t) - \bar{R}(t, T_1) \quad (18.2)$$

$$\bar{R}(t, T_1) = \frac{1}{T_1} \sum_{t'=t+1}^{t+T_1} R(t') \quad (18.3)$$

$$\hat{R}(t, T_1) = \frac{\tilde{R}(t, T_1)}{\sigma(t, T_1)} \quad (18.4)$$

$$[\sigma(t, T_1)]^2 = \frac{1}{T_1 - 1} \sum_{t'=t+1}^{t+T_1} [\tilde{R}(t', T_1)]^2 \quad (18.5)$$

So: $R(t)$ is the return from $t + 1$ to t ; $\bar{R}(t, T_1)$ is the serial mean return from $t + T_1$ to $t + 1$, i.e., over T_1 periods, where T_1 can be chosen to be long enough to provide a reasonable estimate for the volatility (see below); $\tilde{R}(t, T_1)$ is the serially demeaned return; $\sigma(t, T_1)$ is the volatility computed from $t + T_1$ to $t + 1$; and $\hat{R}(t, T_1)$ is the normalized (serially demeaned) return. Below, for notational simplicity we will omit the reference to the T_1 parameter and will use $\hat{R}(t)$ to denote the normalized returns.

⁴Thus, in spirit, it is somewhat similar to the single-stock KNN trading strategy discussed in Sect. 3.17, which utilizes the k-nearest neighbor (KNN) algorithm (as opposed to ANN).

⁵Typically, $RSI > 0.7$ (< 0.3) is interpreted as overbought (oversold). See, e.g., Wilder (1978).

Next, we can define EMAs, EMSDs and RSI as follows⁶:

$$\text{EMA}(t, \lambda, \tau) = \frac{1 - \lambda}{1 - \lambda^\tau} \sum_{t'=t+1}^{t+\tau} \lambda^{t'-t-1} \widehat{R}(t') \tag{18.6}$$

$$[\text{EMSD}(t, \lambda, \tau)]^2 = \frac{1 - \lambda}{\lambda - \lambda^\tau} \sum_{t'=t+1}^{t+\tau} \lambda^{t'-t-1} [\widehat{R}(t') - \text{EMA}(t, \lambda, \tau)]^2 \tag{18.7}$$

$$\text{RSI}(t, \tau) = \frac{v_+(t, \tau)}{v_+(t, \tau) + v_-(t, \tau)} \tag{18.8}$$

$$v_\pm(t, \tau) = \sum_{t'=t+1}^{t+\tau} \max(\pm \widehat{R}(t'), 0) \tag{18.9}$$

Here: τ is the moving average length; λ is the exponential smoothing parameter.⁷

The input layer can then be defined as consisting of, e.g., $\widehat{R}(t)$, $\text{EMA}(t, \lambda_a, \tau_a)$, $\text{EMSD}(t, \lambda_a, \tau_a)$, and $\text{RSI}(t, \tau'_{a'})$, where $a = 1, \dots, m$, $a' = 1, \dots, m'$. The values τ_a can, e.g., be chosen to correspond to 30 min, 1 hr, 3 hrs, and 6 hrs (so $m = 4$; see fn. 7 for the values of λ_a). The values $\tau'_{a'}$ can, e.g., be chosen to correspond to 3 hrs, 6 hrs, and 12 hrs (so $m' = 3$). There is no magic bullet here. These values can be chosen based on out-of-sample backtests keeping in mind, however, the ever-present danger of over-fitting various free parameters (see below), including τ_a , λ_a and $\tau'_{a'}$.

The output layer can be constructed as follows. Let the objective be to forecast which quantile the future normalized return will belong to. Let the number of quantiles be K . Thus, for the values of t corresponding to the training dataset D_{train} ,⁸ we have the normalized returns $\widehat{R}(t)$, $t \in D_{train}$. Let the $(K - 1)$ quantile values of $\widehat{R}(t)$, $t \in D_{train}$, be q_α , $\alpha = 1, \dots, (K - 1)$. For each value of t , we can define the supervisory K -vectors $S_\alpha(t)$, $\alpha = 1, \dots, K$, as follows:

⁶Note that this can be done in more than one way.

⁷To reduce the number of parameters, we can, e.g., take $\lambda = (\tau - 1)/(\tau + 1)$.

⁸Ideally, when computing the quantiles, an appropriate number d_1 of the values of $t = t_d, t_{d-1}, \dots, t_{d-d_1+1}$, $d = |D_{train}|$, should be excluded to ensure that all the EMA, EMSD and RSI values are computed using the required numbers of datapoints.

$$\begin{cases} S_1(t) = 1, & \widehat{R}(t) \leq q_1 \\ S_\alpha(t) = 1, & q_{\alpha-1} \leq \widehat{R}(t) < q_\alpha, \quad 1 < \alpha < K \\ S_K(t) = 1, & q_{K-1} \leq \widehat{R}(t) \\ S_\alpha(t) = 0, & \text{otherwise} \end{cases} \quad (18.10)$$

The output layer can then be a nonnegative K -vector $p_\alpha(t)$, whose elements are interpreted as the probabilities of the future normalized return to be in the α -th quantile. So, we have

$$\sum_{\alpha=1}^K p_\alpha(t) = 1 \quad (18.11)$$

The output layer is constructed from the input layer as some nonlinear function thereof with some number of parameters to be determined via training. In ANN we have L layers labeled by $\ell = 1, \dots, L$, where $\ell = 1$ corresponds to the input layer, and $\ell = L$ corresponds to the output layer. At each layer we have $N^{(\ell)}$ nodes and the corresponding $N^{(\ell)}$ -vectors $\vec{X}^{(\ell)}$ with components $X_{i^{(\ell)}}^{(\ell)}, i^{(\ell)} = 1, \dots, N^{(\ell)}$ ⁹:

$$X_{i^{(\ell)}}^{(\ell)} = h_{i^{(\ell)}}^{(\ell)}(\vec{Y}^{(\ell)}), \quad \ell = 2, \dots, L \quad (18.12)$$

$$Y_{i^{(\ell)}}^{(\ell)} = \sum_{j^{(\ell-1)}=1}^{N^{(\ell-1)}} A_{i^{(\ell)}j^{(\ell-1)}}^{(\ell)} X_{j^{(\ell-1)}}^{(\ell-1)} + B_{i^{(\ell)}}^{(\ell)} \quad (18.13)$$

Here: $\vec{Y}^{(\ell)}$ is an $N^{(\ell)}$ -vector with components $Y_{i^{(\ell)}}^{(\ell)}, i^{(\ell)} = 1, \dots, N^{(\ell)}$; $X_{i^{(1)}}^{(1)}$ are the input data (for each value of t , i.e., $\widehat{R}(t)$, $\text{EMA}(t, \lambda_a, \tau_a)$, $\text{EMSD}(t, \lambda_a, \tau_a)$, and $\text{RSI}(t, \tau'_a)$ – see above); $X_{i^{(L)}}^{(L)}$ are the output data $p_\alpha(t)$ (i.e., $N^{(L)} = K$ and the index $i^{(L)}$ is the same as α); the unknown parameters $A_{i^{(\ell)}j^{(\ell-1)}}^{(\ell)}$ (the so-called weights) and $B_{i^{(\ell)}}^{(\ell)}$ (the so-called bias) are determined via training (see below); and there is much arbitrariness in terms of picking the values of $N^{(\ell)}$ and the so-called activation functions $h_{i^{(\ell)}}^{(\ell)}$. A possible choice (out of myriad others) is as follows (see, e.g., Nakano et al. 2018)¹⁰:

⁹We suppress the time variable t for the sake of notational simplicity.

¹⁰Again, there is no magic bullet here. A priori, a host of activation functions can be used, e.g., sigmoid (a.k.a. logistic), tanh (hyperbolic tangent), rectified linear unit (ReLU), softmax, etc. For some pertinent literature, see, e.g., Bengio (2009), Chandra (2003), da S. Gomes et al. (2011), Glorot et al. (2011),

$$h_{i^{(\ell)}}^{(\ell)}(\vec{Y}^{(\ell)}) = \max\left(Y_{i^{(\ell)}}^{(\ell)}, 0\right), \quad \ell = 2, \dots, L-1 \quad (\text{ReLU}) \quad (18.14)$$

$$h_{i^{(L)}}^{(L)}(\vec{Y}^{(L)}) = Y_{i^{(L)}}^{(L)} \left[\sum_{j^{(L)}=1}^{N^{(L)}} Y_{j^{(L)}}^{(L)} \right]^{-1} \quad (\text{softmax}) \quad (18.15)$$

I.e., ReLU is used at the hidden layers (and the algorithm moves onto the next layer only if some neurons are activated (fired) at layer ℓ , i.e., at least some $Y_{i^{(\ell)}}^{(\ell)} > 0$), and softmax is used at the output layer (so that we have the condition (18.11) by construction). Further, to train the model, i.e., to determine the unknown parameters, some kind of error function E (we suppress its variables) must be minimized, e.g., the so-called cross-entropy (see, e.g., de Boer et al. 2005):

$$E = - \sum_{t \in D_{train}} \sum_{\alpha=1}^K S_{\alpha}(t) \ln(p_{\alpha}(t)) \quad (18.16)$$

To minimize E , one can, e.g., use the stochastic gradient descent (SGD) method, which minimizes the error function iteratively until the procedure converges.¹¹

Finally, we must specify the trading rules. There are a number of possibilities here depending on the number of quantiles, i.e., the choice of K . A reasonable trading signal is given by:

$$\text{Signal} = \begin{cases} \text{Buy,} & \text{iff } \max(p_{\alpha}(t)) = p_K(t) \\ \text{Sell,} & \text{iff } \max(p_{\alpha}(t)) = p_1(t) \end{cases} \quad (18.17)$$

Therefore, the trader buys BTC if the predicted class is $p_K(t)$ (the top quantile), and sells if it is $p_1(t)$ (the bottom quantile). This trading rule can be modified. E.g., the buy signal can be based on the top 2 quantiles, and the sell signal can be based on the bottom 2 quantiles (see, e.g., Nakano et al. 2018).¹²

Goodfellow et al. (2013), Karlik and Vehbi (2011), Mhaskar and Micchelli (1993), Singh and Chandra (2003), Wu (2009).

¹¹A variety of methods can be used. For some pertinent literature, see, e.g., Denton and Hung (1996), Dong and Zhou (2008), Dreyfus (1990), Ghosh (2012), Kingma and Ba (2014), Ruder (2017), Rumelhart et al. (1986), Schmidhuber (2015), Wilson et al. (2018).

¹²Various techniques used in applying ANNs to other asset classes such as equities may also be useful for cryptocurrencies. See, e.g., Ballings et al. (2015), Chong et al. (2017), Dash and Dash (2016), de Oliveira et al. (2013), Sezer et al. (2017), Yao et al. (1999). For some additional literature, see fn. 27 in Chapter 3.

18.3 Strategy: Sentiment Analysis—Naïve Bayes Bernoulli

Social media sentiment analysis based strategies have been used in stock trading¹³ and also applied to cryptocurrency trading. The premise is to use a machine learning classification scheme to forecast, e.g., the direction of the BTC price movement based on tweet data. This entails collecting all tweets containing at least one keyword from a pertinent (to BTC price forecasting) learning vocabulary V over some timeframe, and cleaning this data.¹⁴ The resultant data is then further processed by assigning a so-called feature (M -vector) X_i to each tweet labeled by $i = 1, \dots, N$, where N is the number of tweets in the dataset. Here $M = |V|$ is the number of keywords in the learning vocabulary V . So, the components of each vector X_i are X_{ia} , where $a = 1, \dots, M$ labels the words in V . Thus, if the word $w_a \in V$ labeled by a is not present in the tweet T_i labeled by i , then $X_{ia} = 0$. If w_a is present in T_i , then we can set $X_{ia} = 1$ or $X_{ia} = n_{ia}$, where n_{ia} counts the number of times w_a appears in T_i . In the former case (which is what we focus on in the following) we have a Bernoulli probability distribution, while in the latter case we have a multinomial distribution.

Next, we need to build a model that, given the N feature vectors X_i , predicts one out of a preset number K of outcomes (so-called *classes*) $C_\alpha, \alpha = 1, \dots, K$. E.g., we can have $K = 2$ outcomes, whereby BTC is forecasted to go up or down, which can be used as the buy/sell signal. Alternatively, as in the ANN strategy in Sect. 18.2, we can have K quantiles for the normalized returns $\widehat{R}(t)$, etc. This then defines our trading rules. Once the classes C_α are chosen, a simple way to forecast them is to build a model for conditional probabilities $P(C_\alpha | X_1, \dots, X_N)$. Here, generally, $P(A|B)$ denotes the conditional probability of A occurring assuming B is true. Pursuant to Bayes' theorem, we have

$$P(A|B) = \frac{P(B|A) P(A)}{P(B)} \quad (18.18)$$

¹³For some literature, see, e.g., Bollen and Mao (2011), Bollen et al. (2011), Kordonis et al. (2016), Liew and Budavári (2016), Mittal and Goel (2012), Nisar and Yeung (2018), Pagolu et al. (2016), Rao and Srivastava (2012), Ruan et al. (2018), Sprenger et al. (2014), Sul et al. (2017), Zhang et al. (2011).

¹⁴This, among other things, includes removing duplicate tweets likely generated by ubiquitous Twitter bots, removing the so-called *stop-words* (e.g., “the”, “is”, “in”, “which”, etc.), which do not add value, from the tweets, and performing the so-called *stemming*, i.e., reducing words to their base form (e.g., “investing” and “invested” are reduced to “invest”, etc.). The latter can be achieved using, e.g., the Porter stemming algorithm or other similar algorithms (for some literature, see, e.g., Hull [1996], Porter [1980], Raulji and Saini [2016], Willett [2006]).

where $P(A)$ and $P(B)$ are the probabilities of A and B occurring independently of each other. So, we have

$$P(C_\alpha | X_1, \dots, X_N) = \frac{P(X_1, \dots, X_N | C_\alpha) P(C_\alpha)}{P(X_1, \dots, X_N)} \quad (18.19)$$

Note that $P(X_1, \dots, X_N)$ is independent of C_α and will not be important below. Now, $P(C_\alpha)$ can be estimated from the training data. The primary difficulty is in estimating $P(X_1, \dots, X_N | C_\alpha)$. Here a simplification occurs if we make the “naïve” conditional independence assumption (hence the term “naïve Bayes”), i.e., that, given the class C_α , for all i the feature X_i is conditionally independent of every other feature X_j , $j = 1, \dots, N$ ($j \neq i$):

$$P(X_i | C_\alpha, X_1, \dots, X_{i-1}, X_{i+1}, \dots, X_N) = P(X_i | C_\alpha) \quad (18.20)$$

Then Eq. (18.19) simplifies as follows:

$$P(C_\alpha | X_1, \dots, X_N) = \gamma P(C_\alpha) \prod_{i=1}^N P(X_i | C_\alpha) \quad (18.21)$$

$$\gamma = 1/P(X_1, \dots, X_N) \quad (18.22)$$

The conditional probabilities $P(X_i | C_\alpha)$ can be estimated using the conditional probabilities $P(w_a | C_\alpha)$ for the M words w_a in the learning vocabulary V :

$$P(X_i | C_\alpha) = \prod_{a=1}^M Q_{ia\alpha} \quad (18.23)$$

$$Q_{ia\alpha} = P(w_a | C_\alpha), \quad X_{ia} = 1 \quad (18.24)$$

$$Q_{ia\alpha} = 1 - P(w_a | C_\alpha), \quad X_{ia} = 0 \quad (18.25)$$

The conditional probabilities $P(w_a | C_\alpha)$ can simply be estimated based on the occurrence frequencies of the words w_a in the training data. Similarly, the probabilities $P(C_\alpha)$ can be estimated from the training data.¹⁵ So, if we

¹⁵For some literature on applying Twitter sentiment to Bitcoin trading, see, e.g., Colianni et al. (2015), Georgoula et al. (2015), which also discuss other machine learning methods such as support vector machines (SVM) and logistic regression (a.k.a. logit model). For some literature on Bitcoin trading using other sentiment data, see, e.g., Garcia and Schweitzer (2015), Li et al. (2018). For some literature on applying tree boosting algorithms to cryptocurrency trading, see, e.g., Alessandretti et al. (2018), Li et al. (2018). For some additional pertinent literature (which generally appears to be relatively scarce for BTC compared with similar literature on stock trading), see, e.g., Amjad and Shah (2017), Jiang and Liang (2017), Shah and Zhang (2014).

set the forecasted value C_{pred} of the outcome to that with the maximum $P(C_\alpha | X_1, \dots, X_N)$, then

$$C_{pred} = \operatorname{argmax}_{C_\alpha \in \{1, \dots, K\}} P(C_\alpha) \prod_{i=1}^N \prod_{a=1}^M [P(w_a | C_\alpha)]^{X_{ia}} [1 - P(w_a | C_\alpha)]^{1 - X_{ia}} \quad (18.26)$$

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19

Global Macro

19.1 Generalities

Actually, macro trading strategies constitute an investment style, not an asset class. These types of strategies are not limited to any particular asset class or a geographical region and can invest in stocks, bonds, currencies, commodities, derivatives, etc., seeking to capitalize on regional, economic and political changes around the world. While many macro strategies are based on analysts' subjective opinions (these are discretionary strategies), a systematic approach (non-discretionary strategies) also plays a prominent role. Global macro strategies can vary by their style, e.g., there are directional strategies, long-short strategies, relative value strategies, etc.¹

19.2 Strategy: Fundamental Macro Momentum

This strategy aims to capture returns from the market underreaction to changes in macroeconomic trends by buying (selling) assets favored (adversely affected) by incoming macroeconomic trends. Different asset classes can be used in building an investment portfolio, e.g., global equity indexes, currencies,

¹Macro strategies can be divided into 3 classes: discretionary macro, systematic macro, and CTA/managed futures. For some literature on macro strategies and related topics, see, e.g., Asgharian et al. (2004), Chung (2000), Connor and Woo (2004), Dobson (1984), Drobny (2006), Fabozzi et al. (2010), Fung and Hsieh (1999), Gliner (2014), Kidd (2014), Lambert et al. (2006), Potjer and Gould (2007), Stefanini (2006), Zaremba (2014).

government bonds, etc.² The “state variables” to consider are the business cycle, international trade, monetary policy, and risk sentiment trends (see, e.g., Brooks 2017).³ E.g., equity indexes from some number of countries are ranked using the values of the aforesaid 4 state variables for each country.⁴ A zero-cost portfolio can then be constructed by, e.g., going long the indexes in the top decile and shorting those in the bottom decile. The so-constructed portfolios for various asset classes can, e.g., be combined with equal weights. Typically, the holding period ranges from three to six months.

19.3 Strategy: Global Macro Inflation Hedge

Exogenous shocks (such as a political or geopolitical issue) can have an impact on commodity prices such as oil leading to an increase in prices in oil-dependent economies. There are two steps in this process: (i) a pass-through from commodity prices to the headline inflation (HI), and (ii) then, a pass-through from HI to the core inflation (CI).⁵ I.e., HI quickly reflects various shocks around the world. So, the global macro inflation hedge strategy is based on the spread between HI and CI as an indicator to hedge inflation using commodities⁶:

$$CA = \max \left(0, \min \left(\frac{HI_{YoY} - CI_{YoY}}{HI_{YoY}}, 1 \right) \right) \quad (19.1)$$

Here: CA is the commodity allocation percentage within the portfolio, and “YoY” stands for “year-on-year”. The hedge can be executed by, e.g., buying a basket of various commodities through ETFs, futures, etc. (see, e.g., Fulli-Lemaire 2013).

²Different asset classes are affected by the same macroeconomic trends differently. E.g., increasing growth is positive for equities and currencies, but negative for bonds.

³Business cycle trends can be estimated using 1-yr changes in the real GDP growth and CPI inflation forecast, each contributing with a 50% weight. International trade trends can be estimated using 1-yr changes in spot FX rates against an export-weighted basket. Monetary policy trends can be estimated using 1-yr changes in short-term rates. Risk sentiment trends can be estimated using 1-yr equity market excess returns. For some literature on the rationale behind these variables, see, e.g., Bernanke and Kuttner (2005), Clarida and Waldman (2007), Eichenbaum and Evans (1995).

⁴There is a variety of ways to do this ranking using the 4 variables. See, e.g., Sect. 3.6.

⁵HI is the raw inflation measured by indices such as the Consumer Price Index (CPI) based on prices of goods and services in a broad basket, while CI excludes some products such as commodities, which are highly volatile and add sizable noise to the index. For some pertinent literature, see, e.g., Blanchard and Gali (2007), Blanchard and Riggi (2013), Clark and Terry (2010), Hamilton (2003), Marques et al. (2003), Trehan (2005), van den Noord and André (2004).

⁶For some literature on using commodities as an inflation hedge, see, e.g., Amenc et al. (2009), Bodie (1983), Bodie and Rosansky (1980), Greer (1978), Hoevenaars et al. (2008), Jensen et al. (2002).

19.4 Strategy: Global Fixed-Income Strategy

This systematic macro trading strategy is based on a cross-sectional analysis of government bonds from various countries using variables such as (see, e.g., Brück and Fan 2017) GDP, inflation, sovereign risk, real interest rate, output gap, value, momentum, term spread, and the so-called Cochrane-Piazzesi predictor (Cochrane and Piazzesi 2005). Thus, said bonds can be ranked based on these factors and a zero-cost portfolio can be constructed by buying bonds in the top quantile and selling bonds in the bottom quantile. Similarly to Sect. 3.6, multifactor portfolios can also be constructed. Typically, country-bond ETFs are used in such portfolios.⁷

19.5 Strategy: Trading on Economic Announcements

Empirical evidence suggests that stocks tend to yield higher returns on important announcement dates such Federal Open Market Committee (FOMC) announcements.⁸ So, a simple macro trading strategy consists of buying stocks on important announcement days (ADs), such as the FOMC announcements, and switching to risk-free assets during non-announcement days (NDAs). This is done via ETFs, futures, etc., as opposed to individual stocks, as the strategy involves moving from 100% allocated in equities to 100% allocated in Treasuries (see, e.g., Stotz 2016).⁹

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⁷For some literature on factor investing in fixed-income assets, see, e.g., Beekhuizen et al. (2016), Correia et al. (2012), Houweling and van Vundert (2017), Kojien et al. (2018), L'Hoir and Boulhabel (2010), Staal et al. (2015).

⁸For some pertinent literature, see, e.g., Ai and Bansal (2016), Bernanke and Kuttner (2005), Boyd et al. (2005), Donninger (2015), Graham et al. (2003), Jones et al. (1998), Lucca and Moench (2012), Savor and Wilson (2013).

⁹This strategy can be augmented with various (e.g., technical) filters (see, e.g., Stotz 2016).

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20

Infrastructure

Broadly, investing in infrastructure includes investing in long-term projects such as transportation (roads, bridges, tunnels, railways, ports, airports, etc.), telecommunications (transmission cables, satellites, towers, etc.), utilities (electricity generation, gas or electricity transmission or distribution, water supply, sewage, waste, etc.), energy (including but not limited to renewable energy), healthcare (hospitals, clinics, senior homes, etc.), educational facilities (schools, universities, research institutes, etc.), etc. An investor can gain exposure to infrastructure assets through different direct or indirect investments such private equity-type investments (e.g., via unlisted infrastructure funds), listed infrastructure funds, stocks of publicly traded infrastructure companies, municipal bonds earmarked to infrastructure projects, etc.¹

Infrastructure investments, by their nature, are long-term, buy-and-hold investments. One investment strategy is to use infrastructure assets to improve risk-adjusted returns of well-diversified portfolios, e.g., via tracking ETFs,

¹For some literature on infrastructure as an asset class and related topics, see, e.g., Ansar et al. (2016), Bitsch et al. (2010), Blanc-Brude et al. (2016, 2017), Blundell (2006), Clark (2017), Clark et al. (2012), Finkenzeller et al. (2010), Grigg (2010), Grimsey and Lewis (2002), Hartigan et al. (2011), Helm (2009), Helm and Tindall (2009), Herranz-Loncán (2007), Inderst (2010a), McDevitt and Kirwan (2008), Newell et al. (2009), Newell and Peng (2008), Peng and Newell (2007), Ramamurti and Doh (2004), Rickards (2008), Sanchez-Robles (1998), Sawant (2010a, b), Singhal et al. (2011), Smit and Trigeorgis (2009), Torrance (2007), Vives (1999), Weber et al. (2016), Wurstbauer et al. (2016).

global infrastructure funds, unlisted infrastructure funds, etc.² Another investment strategy is to use infrastructure assets for inflation hedging.³ Yet another investment strategy is to generate stable cash flows from infrastructure investments. For this purpose, “brownfield” projects (associated with established assets in need of improvement) are more appropriate than “greenfield” projects (associated with assets to be constructed). Diversification across different sectors can be beneficial in this regard.⁴

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²See, e.g., Dechant and Finkenzeller (2013), Haran et al. (2011), Joshi and Lambert (2011), Martin (2010), Nartea and Eves (2010), Newell et al. (2011), Oyedele et al. (2014), Panayiotou and Medda (2016), Rothballer and Kaserer (2012).

³Infrastructure, as real estate, can be an inflation-hedging investment, albeit apparently with some heterogeneity. For some literature, see, e.g., Armann and Weisdorf (2008), Bird et al. (2014), Inderst (2010b), Würstbauer and Schäfers (2015), Rödel and Rothballer (2012).

⁴For some pertinent literature, see, e.g., Arezki and Sy (2016), Espinoza and Luccioni (2002), Leigland (2018), Panayiotou and Medda (2014), Weber et al. (2008).

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Appendix A: R Source Code for Backtesting

In this appendix we give the R (R Package for Statistical Computing, <http://www.r-project.org>) source code for backtesting intraday strategies, where the position is established at the open and liquidated at the close of the same day. The sole purpose of this code is to illustrate some simple tricks for doing out-of-sample backtesting. In particular, this code does not deal with the survivorship bias in any way,¹ albeit for this kind of strategies—precisely because these are intraday strategies—the survivorship bias is not detrimental (see, e.g., Kakushadze 2015b).²

The main function (which internally calls some subfunctions) is `qrm.backtest()` with the following inputs: (i) `days` is the lookback; (ii) `d.r` is used for computing risk, both as the length of the moving standard deviation `tr` (computed internally over `d.r`-day moving windows) as well as the lookback for computing the risk model (and, if applicable, a statistical industry classification)—see below; (iii) `d.aadv` is used as the lookback for the average daily dollar volume `aadv`, which is computed internally; (iv) `n.aadv` is the number of top tickers by `aadv` used as the trading universe, which is recomputed every `d.r` days; (v) `inv.lvl` is the total investment level (long plus short, and the strategy is dollar-neutral); (vi) `bnds` controls the position bounds (which are the same in this strategy as the trading bounds), i.e., the

¹I.e., simply put, it does not account for the fact that in the past there were tickers that are no longer there at present, be it due to bankruptcies, mergers, acquisitions, etc. Instead, the input data is taken for the tickers that exist on a given day by looking back, say, some number of years.

²For some literature related to the survivorship bias, which is important for longer-horizon strategies, see, e.g., Amin and Kar (2003), Brown et al. (1992), Bu and Lacey (2007), Carhart et al. (2002), Davis (1996), Elton et al. (1996b), Garcia and Gould (1993).

dollar holdings H_i for each stock are bounded via (B_i are the bounds elements, which can be uniform)

$$|H_i| \leq B_i A_i \quad (\text{A.1})$$

where $i = 1, \dots, N$ labels the stocks in the trading universe, and A_i are the corresponding elements of `addv`; (vii) `incl.cost` is a Boolean for including linear trading costs, which are modeled as follows.³ For the stock labeled by i , let E_i be its expected return, and w_i be its weight in the portfolio. The source code below determines w_i via (mean-variance) optimization (with bounds). For the stock labeled by i , let the linear trading cost per *dollar* traded be τ_i . Including such costs in portfolio optimization amounts to replacing the expected return of the portfolio

$$E_{port} = \sum_{i=1}^N E_i w_i \quad (\text{A.2})$$

by

$$E_{port} = \sum_{i=1}^N [E_i w_i - \tau_i |w_i|] \quad (\text{A.3})$$

A complete algorithm for including linear trading costs in mean-variance optimization is given in, e.g., Kakushadze (2015b). However, for our purposes here the following simple “hack” suffices. We can define the effective return

$$E_i^{eff} = \text{sign}(E_i) \max(|E_i| - \tau_i, 0) \quad (\text{A.4})$$

and simply set

$$E_{port} = \sum_{i=1}^N E_i^{eff} w_i \quad (\text{A.5})$$

I.e., if the magnitude for the expected return for a given stock is less than the expected cost to be incurred, we set the expected return to zero, otherwise we reduce said magnitude by said cost. This way we can avoid a nontrivial iterative procedure (see, e.g., Kakushadze 2015b), albeit this is only an approximation.

³Here we closely follow the discussion in Sect. 3.1 of Kakushadze and Yu (2018b).

So, what should we use as τ_i in (A.4)? The model of Almgren et al. (2005) is reasonable for our purposes here. Let H_i be the *dollar* amount traded for the stock labeled by i . Then for the linear trading costs we have

$$T_i = \zeta \sigma_i \frac{|H_i|}{A_i} \quad (\text{A.6})$$

where σ_i is the historical volatility, A_i is the average daily dollar volume (ADDV), and ζ is an overall normalization constant we need to fix. However, above we work with weights w_i , not traded dollar amounts H_i . In our case of a purely intraday trading strategy discussed above, they are related simply via $H_i = I w_i$, where I is the total investment level (i.e., the total absolute dollar holdings of the portfolio after establishing it). Therefore, we have (note that $T_i = \tau_i |H_i| = \tau_i I |w_i|$)

$$\tau_i = \zeta \frac{\sigma_i}{A_i} \quad (\text{A.7})$$

We will fix the overall normalization ζ via the following heuristic. We will (conservatively) assume that the average linear trading cost per dollar traded is 10 bps (1 bps = 1 basis point = 1/100 of 1%),⁴ i.e., $\text{mean}(\tau_i) = 10^{-3}$ and $\zeta = 10^{-3}/\text{mean}(\sigma_i/A_i)$.

Next, internally the code sources price and volume data by reading it from tab-delimited files⁵ `nrm.ret.txt` (overnight return internally referred to as `ret`—see below), `nrm.open.txt` (daily raw, unadjusted open price, internally referred to as `open`), `nrm.close.txt` (daily raw, unadjusted close price, internally referred to as `close`), `nrm.vol.txt` (daily raw, unadjusted volume, internally referred to as `vol`), `nrm.prc.txt` (daily close price fully adjusted for all splits and dividends, internally referred to as `prc`). The rows of `ret`, `open`, `close`, `vol` and `prc` correspond to the N tickers (index i). Let trading days be labeled by $t = 0, 1, 2, \dots, T$, where $t = 0$ is the most recent day. Then the columns of `open`, `close`, `vol` and `prc` correspond to the trading days $t = 1, 2, \dots, T$, i.e., the value of t is the same as the value of the column index. On the other hand, the columns of `ret` correspond to the overnight close-to-open returns from the trading day t to the trading day $t - 1$. I.e., the first column of `ret` corresponds to the overnight close-to-open return from the trading day $t = 1$ to the trading day $t = 0$. Furthermore, `ret`,

⁴This amounts to assuming that, to establish an equally-weighted portfolio, it costs 10 bps.

⁵This specific code does not use high, low, VWAP (volume-weighted average price), intraday (e.g., minute-by-minute) prices, etc. However, it is straightforward to modify it such that it does.

call it $R_i(t)$, where $t = 1, 2, \dots, T$ labels the columns of `ret`, is computed as follows:

$$R_i(t) = \ln \left(\frac{P_i^{AO}(t-1)}{P_i^{AC}(t)} \right) \quad (\text{A.8})$$

$$P_i^{AO}(t) = \gamma_i^{adj}(t) P_i^O(t) \quad (\text{A.9})$$

$$\gamma_i^{adj}(t) = \frac{P_i^{AC}(t)}{P_i^C(t)} \quad (\text{A.10})$$

Here: $P_i^O(t)$ is the raw open price (which is the corresponding element of `open` for $t = 1, 2, \dots, T$); $P_i^C(t)$ is the raw close price (which is the corresponding element of `close` for $t = 1, 2, \dots, T$); $P_i^{AC}(t)$ is the fully adjusted close price (which is the corresponding element of `prc` for $t = 1, 2, \dots, T$); $\gamma_i^{adj}(t)$ is the adjustment factor, which is used for computing the fully adjusted open price $P_i^{AO}(t)$; so $R_i(t)$ is the overnight, close-to-open return based on fully adjusted prices. Note that the $t = 0$ prices required for computing $R_i(1)$ are *not* part of the matrices `open`, `close` and `prc`. Also, the code internally assumes that the matrices `ret`, `open`, `close`, `vol` and `prc` are all aligned, i.e., all tickers and dates are the same and in the same order in each of the 5 files `nrm.ret.txt` (note the labeling of the returns described above), `nrm.open.txt`, `nrm.close.txt`, `nrm.vol.txt` and `nrm.prc.txt`. The ordering of the tickers in these files is immaterial, so long as it is the same in all 5 files as the code is oblivious to this ordering. However, the dates must be ordered in the descending order, i.e., the first column corresponds to the most recent date, the second column corresponds to the date before it, etc. (here “date” corresponds to a trading day). Finally, note that the internal function `read.x()` reads these files with the parameter value `as.is = T`. This means that these files are in the “R-ready” tab-delimited format, with $N + 1$ tab-delimited lines. The lines 2 through $N + 1$ have $T + 1$ elements each, the first element being a ticker symbol (so the N ticker symbols comprise `dimnames(.)[[1]]` of the corresponding matrix, e.g., `open` for the open prices), and the other T elements being the T values (e.g., $P_i^O(t)$, $t = 1, \dots, T$, for the open prices). However, the first line has only T elements, which are the labels of the trading days (so these comprise `dimnames(.)[[2]]` of the corresponding matrix, e.g., `open` for the open prices). Internal functions that use this input data, such as `calc.mv.avg()` (which computes simple moving averages) and `calc.mv.sd()` (which computes simple moving standard deviations) are simple and self-explanatory.

As mentioned above, the input parameter `d.r` is used for recomputing the trading universe every `d.r` trading days and also recomputing the risk models (see below) every `d.r` trading days. These computations are done 100% out-of-sample, i.e., the data used in these computations is 100% in the past w.r.t. to the trading day on which the resultant quantities are used for (simulated) trading. This is accomplished in part by using the internal function `calc.ix()`. Note that the input data described above is structured and further used in such a way that the backtests are 100% out-of-sample. Here two conceptually different aspects must be distinguished. Thus, we have the expected returns and “the rest”, the latter—which can be loosely referred to as “risk management”—being the universe selection, the risk model computation, etc., i.e., the machinery that gets us from the expected returns to the desired holdings (that is, the strategy positions). The risk management part must be 100% out-of-sample. In real life the expected returns are also 100% out-of-sample. However, in backtesting, while the expected returns cannot under any circumstances look into the future, they can sometimes be “borderline in-sample”. Thus, consider a strategy that today trades on the overnight yesterday’s-close-to-today’s-open return. If we assume that the positions are established based on this return sometime after the open, then the backtest is out-of-sample by the “delay” time between the open and when the position is established. However, if we assume that the position is established at the open, then this is the so-called “delay-0” strategy, and the backtest is “borderline in-sample” in the sense that in real life the orders would have to be sent with some, albeit possibly small, delay, but could never be executed exactly at the open. In this sense it still makes sense to backtest such a strategy to measure the strength of the signal. What would make no sense and should never be done is to run an outright in-sample backtest that looks into the future. E.g., using today’s closing prices for computing expected returns for trading at today’s open would be grossly in-sample. On the other hand, using yesterday’s prices to trade at today’s open is the so-called “delay-1” strategy, which is basically 1 day out-of-sample (and, not surprisingly, is expected to backtest much worse than a delay-0 strategy). The code gives examples of both delay-0 (mean-reversion) and delay-1 (momentum) strategies (see the comments `DELAY-0` and `DELAY-1` in the code).

The code internally computes the desired holdings via optimization. The optimizer function (which incorporates bounds and linear constraints such as dollar-neutrality) `bopt.calc.opt()` is given in Kakushadze (2015e). One of its inputs is the inverse model covariance matrix for the stocks. This matrix is computed internally via functions such as `qrm.cov.pc()` and `qrm.erank.pc()`, which are given in and utilize the statistical risk model construction of Kakushadze and Yu (2017a), or `qrm.gen.het()`,

which is given in and utilizes the heterotic risk model construction of Kakushadze and Yu (2016a). The latter requires a multilevel binary industry classification. The code below builds such a classification via the function `qrm.stat.ind.class.all()`, which is given in and utilizes the statistical industry classification construction of Kakushadze and Yu (2016b). However, the code can be straightforwardly modified to utilize a fundamental industry classification, such as GICS (Global Industry Classification Standard), BICS (Bloomberg Industry Classification System), SIC (Standard Industrial Classification), etc. One issue with this is that practically it is difficult to do this 100% out-of-sample. However, “in-sampleness” of a fundamental industry classification—which is relatively stable—typically does not pose a serious issue in such backtests as stocks rarely jump industries. Furthermore, note that the aforesaid “external” functions have various other parameters (which are set to their implicit default values in the code below), which can be modified (see the references above that provide the aforesaid functions).

Finally, the code internally computes the desired holdings and various performance characteristics such as the total P&L over the backtesting period, annualized return, annualized Sharpe ratio, and cents-per-share. These and other quantities computed internally can be returned (e.g., via environments or lists), dumped into files, printed on-screen, etc. The code is straightforward and can be tweaked depending on the user’s specific needs/strategies. Its purpose is illustrative/pedagogical.

```
qrm.backtest <- function (days = 252 * 5, d.r = 21,
d.addv = 21, n.addv = 2000, inv.lvl = 2e+07, bnds = .01,
incl.cost = F)
{
  calc.ix <- function(i, d, d.r)
  {
    k1 <- d - i
    k1 <- trunc(k1 / d.r)
    ix <- d - k1 * d.r
    return(ix)
  }

  calc.mv.avg <- function(x, days, d.r)
  {
    y <- matrix(0, nrow(x), days)
    for(i in 1:days)
      y[, i] <- rowMeans(x[, i:(i + d.r - 1)])
  }
}
```

```
    return(y)
  }

calc.mv.sd <- function(x, days, d.r)
{
  y <- matrix(0, nrow(x), days)
  for(i in 1:days)
    y[, i] <- apply(x[, i:(i + d.r - 1)], 1, sd)

  return(y)
}

read.x <- function(file)
{
  x <- read.delim(file, as.is = T)
  x <- as.matrix(x)
  mode(x) <- "numeric"
  return(x)
}

calc.sharpe <- function (pnl, inv.lvl)
{
  print(sum(pnl, na.rm = T))
  print(mean(pnl, na.rm = T) * 252 / inv.lvl * 100)
  print(mean(pnl, na.rm = T) / sd(pnl, na.rm = T)
        * sqrt(252))
}

ret <- read.x("nrm.ret.txt")
open <- read.x("nrm.open.txt")
close <- read.x("nrm.close.txt")
vol <- read.x("nrm.vol.txt")
prc <- read.x("nrm.prc.txt")

addv <- calc.mv.avg(vol * close, days, d.addv)
ret.close <- log(prc[, -ncol(prc)]/prc[, -1])
tr <- calc.mv.sd(ret.close, days, d.r)

ret <- ret[, 1:days]
```

```

prc <- prc[, 1:days]
close <- close[, 1:days]
open <- open[, 1:days]
close1 <- cbind(close[, 1], close[, -ncol(close)])
open1 <- cbind(close[, 1], open[, -ncol(open)])

pnl <- matrix(0, nrow(ret), ncol(ret))
des.hold <- matrix(0, nrow(ret), ncol(ret))

for(i in 1:ncol(ret))
{
  ix <- calc.ix(i, ncol(ret), d.r)
  if(i == 1)
    prev.ix <- 0

  if(ix != prev.ix)
  {
    liq <- addv[, ix]
    x <- sort(liq)
    x <- x[length(x):1]
    take <- liq >= x[n.addv]

    r1 <- ret.close[take, (ix:(ix + d.r - 1))]

    ### ind.list <- qrm.stat.ind.class.all(r1,
    ###   c(100, 30, 10), iter.max = 100)

    ### rr <- qrm.gen.het(r1, ind.list)

    rr <- qrm.cov.pc(r1)
    ### rr <- qrm.erank.pc(r1)

    cov.mat <- rr$inv.cov
    prev.ix <- ix
  }

  w.int <- rep(1, sum(take))
  ret.opt <- ret ### DELAY-0 MEAN-REVERSION
  ### ret.opt <- -log(close/open) ### DELAY-1 MOMENTUM

```

```
if(incl.cost)
{
  lin.cost <- tr[take, i] / advv[take, i]
  lin.cost <- 1e-3 * lin.cost / mean(lin.cost)
}
else
  lin.cost <- 0

ret.lin.cost <- ret.opt[take, i]
ret.lin.cost <- sign(ret.lin.cost) *
  pmax(abs(ret.lin.cost) - lin.cost, 0)

des.hold[take, i] <- as.vector(bopt.calc.opt
  (ret.lin.cost, w.int,
  cov.mat, bnds * liq[take]/inv.lvl, -bnds
  * liq[take]/inv.lvl))

des.hold[take, i] <- -des.hold[take, i] *
  inv.lvl / sum(abs(des.hold[take, i]))

pnl[take, i] <- des.hold[take, i] *
  (close1[take, i]/open1[take, i] - 1)

pnl[take, i] <- pnl[take, i] - abs(des.hold[take,
  i]) * lin.cost
}

des.hold <- des.hold[, -1]
pnl <- pnl[, -1]
pnl <- colSums(pnl)
calc.sharpe(pnl, inv.lvl)

trd.vol <- 2 * sum(abs(des.hold/open1[, -1]))
cps <- 100 * sum(pnl) / trd.vol
print(cps)
}
```

Appendix B: Disclaimers

Wherever the context so requires, the masculine gender includes the feminine and/or neuter, and the singular form includes the plural and *vice versa*. The author of this book (“Author”) and his affiliates including without limitation Quantigic[®] Solutions LLC (“Author’s Affiliates” or “his Affiliates”) make no implied or express warranties or any other representations whatsoever, including without limitation implied warranties of merchantability and fitness for a particular purpose, in connection with or with regard to the content of this book including without limitation any code or algorithms contained herein (“Content”).

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Glossary

absolute momentum: time-series momentum.

acquirer company: the company purchasing another company (target company) in a corporate acquisition.

activation function: a function that defines the output of a node (artificial neuron) in an artificial neural network given an input (or a set of inputs).

active investing (a.k.a. active management): an investment strategy that involves active (frequent) buying and selling of securities in a portfolio (cf. *passive investing*) with the view of exploiting (perceived) profit-generating opportunities.

actively managed ETF: an exchange-traded fund whose underlying portfolio allocation is actively managed.

adjusted price: a stock's price adjusted for splits and dividends.

adverse selection: an effect caused by smart order flow, whereby most limit orders to buy at the bid (sell at the ask) get filled when the market is trading through them downward (upward).

aggressive order: a market order, or a marketable limit order (to buy at the ask or higher, or to sell at the bid or lower).

aggressive order flow: order flow comprised of aggressive orders.

alpha: following common trader lingo, any reasonable “expected return” that one may wish to trade on.

alpha portfolio (a.k.a. alpha combo): a portfolio of (typically, a large number of) alphas combined with some weights.

alpha rotation: a type of ETF trading strategy.

American option: an option (e.g., call or put) that can be exercised on any trading day on or before expiration.

announcement days: days with important economic announcements such as FOMC announcements (cf. *non-announcement days*).

annualization factor: a multiplicative factor for annualizing a quantity.

annualized return: an average daily return times 252 (the number of trading days in a year).

annualized Sharpe ratio: a daily Sharpe ratio times the square root of 252 (the number of trading days in a year).

appraised value: an evaluation of a property’s or some other valuable object’s (e.g., jewelry) value at a given time.

arbitrage: taking advantage of a (perceived) mispricing (a.k.a. arbitrage opportunity) in one or more securities to make a profit.

arbitrage trade: a set of transactions executed with the view of exploiting an arbitrage opportunity.

artificial neural network (ANN): a computing system (inspired by the neural structure of a brain) of nodes (artificial neurons) linked by connections (akin to the synapses in a brain) that can transmit signals from one node to another.

Asian option: an option whose payoff is determined by the average underlying price over some preset time period.

ask (a.k.a. ask price, or offer, or offer price): the price at which a seller is willing (offering) to sell.

asset allocation: assigning weights (allocation percentages) to the assets in a portfolio, typically based on risk-reward considerations.

asset-backed security (ABS): a financial security collateralized by a pool of assets such as loans, mortgages, royalties, etc.

asset class: a group of securities with similar characteristics.

at-the-money (ATM) option: an option whose exercise price is the same as the current price of the underlying asset.

attachment (a.k.a. attachment point): the percentage of the underlying portfolio loss at which a tranche of a CDO (collateralized debt obligation) starts to lose value.

back leg: longer-maturity bonds in a yield curve spread strategy (flattener or steepener).

backspread: a type of options strategies.

backtest: a simulation of strategy performance using historical data.

backtesting period: the historical period over which a backtest is performed.

backwardation: when the futures curve (term structure) is downward-sloping.

bank deposit certificate (a.k.a. certificate of deposit, or CD): a savings certificate (a promissory note issued by a bank) with a fixed maturity date and interest rate.

banker's acceptance (BA): a short-term debt instrument issued by a company and guaranteed by a commercial bank.

bankruptcy: a legal status (imposed by a Court order) of a company that cannot repay debts to its creditors.

barbell: a bond portfolio consisting of bonds with only two (typically, short and long) maturities.

barrier option: an option that can be exercised only if the underlying security's price passes a certain level or "barrier".

base form (a.k.a. stem): in linguistics, the part of a word that is common to all its inflected variants.

basis point (bps): 1/100 of 1%.

basket: a portfolio of assets combined with some weights.

Bayes' theorem: $P(A|B) = P(B|A) \times P(A)/P(B)$, where $P(A|B)$ is the conditional probability of A occurring assuming B is true, and $P(A)$ and $P(B)$ are the probabilities of A and B occurring independently of each other.

bearish outlook: when a trader expects the market or a security to trade lower.

bearish strategy: a directional strategy where the trader profits if the underlying instrument's price goes down.

Bermudan option: an option that can be exercised only on specified dates on or before expiration.

Bernoulli probability distribution: a discrete probability distribution of a random variable which takes the value 1 with probability p and the value 0 with probability $q = 1 - p$.

bias: in an artificial neural network, the inhomogeneous component of the argument of an activation function.

bid (a.k.a. bid price): the price at which a buyer is willing to buy.

bid-ask spread: ask price minus bid price.

binary industry classification: an industry classification where each company belongs to one and only one sub-industry, industry, sector, etc.

binary option (a.k.a. digital option, or all-or-nothing option): an option that pays a preset amount, say, \$1, if the underlying security meets a predefined condition on expiration, otherwise it simply expires without paying anything to the holder.

bisection method: a root-finding method that repeatedly bisects an interval and selects a subinterval in which a root must lie for further examination.

Bitcoin (BTC): the world's first decentralized digital currency (cryptocurrency).

black-box algorithm: an algorithm that can be viewed in terms of its inputs and outputs, without any knowledge of its internal workings.

Black-Scholes model (a.k.a. Black-Scholes-Merton model): a mathematical model of stock (or other underlying asset) dynamics used in pricing options and other derivatives, where the log of the underlying price is described by a Brownian motion with a constant drift.

blockchain: a distributed ledger for keeping a record of all transactions that consists of a sequential chain of blocks, linked using cryptography and time-stamping, and containing transaction records.

body: the middle (by maturity in bond portfolios, and by strike price in option portfolios) leg of a butterfly portfolio.

bond: a fixed-income instrument, a promise of being paid some amount (principal) at some future time T (maturity), and possibly some smaller amounts (coupon payments) at some times prior to T .

bond immunization: matching the duration of a bond portfolio to the maturity of a future cash obligation.

bond maturity: the time at which the principal of a bond is paid.

bond principal: the amount the borrower (bond issuer) owes to the bondholder in full at bond maturity.

- bond value:** the worth of a bond at a given time before maturity.
- bond yield (here, yield to maturity):** the overall interest rate earned assuming the bond is held until maturity and all coupon and principal payments are made as promised.
- bond yield spread (a.k.a. bond spread):** the spread between the bond yield and the risk-free rate.
- bondholder:** bond owner.
- book-to-market ratio:** the company's total book value divided by its market capitalization (same as B/P ratio).
- book-to-price ratio (a.k.a. B/P ratio):** the company's book value per share outstanding divided by its stock share price.
- book value:** the company's total assets minus its total liabilities.
- Boolean:** a binary variable with only two possible values, TRUE and FALSE.
- box:** an option trading strategy.
- break-even price (a.k.a. break-even point):** a price of the underlying security (e.g., stock) in an option trading strategy at which it breaks even (i.e., when the P&L is zero).
- breakeven rate:** the fixed rate of an inflation swap.
- broad market index:** an index based on a broad cross-section of securities (e.g., S&P 500, Russell 3000, etc.).
- brownfield project:** a project associated with established infrastructure assets in need of improvement.
- Brownian motion (a.k.a. Wiener process):** a continuous-time (t) stochastic process W_t , where $W_0 = 0$, W_t is a normal random variable with mean 0 and variance t , and the increment $W_{s+t} - W_s$ is a normal random variable with mean 0 and variance t and is independent of the history of what the process did up to time s .

Btu: British thermal unit, approximately 1,055 Joules.

bubble (a.k.a. economic, asset, speculative, market, price or financial bubble): an asset trading at prices strongly inflated compared with its intrinsic value.

bullet: a bond portfolio where all bonds have the same maturity.

bullish outlook: when a trader expects the market or a security to trade higher.

bullish strategy: a directional strategy where the trader profits if the underlying instrument's price goes up.

butterfly: a portfolio (of bonds or options) with 3 legs, two peripheral (by maturity in bond portfolios, and by strike price in option portfolios) wings and a body in the middle.

butterfly spread: a butterfly option strategy.

buy-and-hold asset/investment: an asset/investment for a passive long-term strategy where the investor holds a long position irrespective of short-term fluctuations in the market.

buy-write strategy: buying stock and writing (selling) a call option against the stock position.

calendar spread (for futures): buying (selling) a near-month futures and selling (buying) a deferred-month futures.

calendar spread (for options): buying a longer-expiration option (call or put) and selling a shorter-expiration option (of the same type, for the same underlying, and with the same strike price).

call option (a.k.a. call): see *European call option, option*.

Canary option: an option that can be exercised, say, quarterly, but not before a determined time period, say, 1 year, has elapsed.

cancel-replaced order: a placed order that has been subsequently canceled and replaced with another order.

canceled order: a placed order that has been subsequently canceled.

capital allocation: see *asset allocation*.

capital gain strategy: a strategy that profits from buying and selling an asset (or, more generally, establishing and liquidating a position).

Carhart's momentum factor (a.k.a. MOM): winners minus losers by (12-month) momentum.

carry (a.k.a. cost of carry): a return (positive or negative) from holding an asset.

carry trade (a.k.a. carry strategy): a strategy based on earning a spread between borrowing a low carry asset and lending a high carry asset.

cash (for indexes): in common trader lingo, "cash" refers to the underlying index portfolio (e.g., the S&P 500 stocks for the S&P 500 index).

cash-equivalent asset: a highly liquid short-term investment security with high credit quality (e.g., REPO).

cash flow: the net amount of cash and cash-equivalent assets being transferred into and out of a company (in the business context) or a portfolio (in the trading context).

cash flow shortfall: the amount by which a financial obligation or liability exceeds the amount of cash (or, more generally, liquid funds) that is available.

cash merger: a merger where the acquirer company pays the target company's shareholders cash for its stock.

CDO tranche: a part of a CDO consisting of assets with different credit ratings and interest rates.

CDO tranche spread: for achieving a null MTM of a CDO tranche, the value of the default leg of the tranche divided by its risky duration.

CDS basis: CDS spread minus bond yield spread.

CDS basis arbitrage (a.k.a. CDS arbitrage): buying a bond and insuring

it with a CDS.

CDS index: a credit default swap index such as CDX and iTraxx.

CDS spread: a periodic (e.g., annual) premium per dollar of the insured debt.

cents-per-share (CPS): the realized P&L in cents (as opposed to dollars) divided by the total shares traded (which includes both establishing and liquidating trades).

channel: a range/band, bounded by a ceiling and a floor, within which the stock price fluctuates.

Chapter 11: a chapter of Title 11, the United States Bankruptcy Code.

cheap stock: a stock that is perceived to be undervalued by some criterion.

claim: the payoff of an option (or some other derivative).

class: in machine learning, one of the possible predicted outcomes of a machine learning algorithm.

close (a.k.a. close price, or closing price): the closing price of a stock at the NYSE close (4:00 PM Eastern Time).

close-to-close return: the return from the close of the previous trading day to the close of the current trading day.

close-to-open return: the return from the close of the previous trading day to the open of the current trading day.

clustering algorithm: grouping objects (into clusters) based on some similarity criterion (or criteria).

Cochrane-Piazzesi predictor: a bond return predictor.

collar (a.k.a. fence): an option trading strategy.

collateral: something of value pledged as security for repayment of a loan,

forfeited if the borrower defaults.

collateralized debt obligation (CDO): an asset-backed security (ABS) consisting of a basket of assets such as bonds, credit default swaps, etc.

combo (for options): a type of option trading strategies.

commercial paper: short-term unsecured promissory notes issued by companies.

commercial real estate: real estate property used for business purposes (rather than living space), e.g., shopping centers, retail shops, office space, etc.

Commitments of Traders (COT): weekly reports provided by CFTC.

commodity: a raw material (e.g., gold, silver, oil, copper) or an agricultural product (e.g., wheat, soy, rice) that can be bought and sold.

commodity allocation percentage (CA): the allocation weight for commodities included as an inflation hedge in a portfolio of other assets.

commodity futures: futures contracts on commodities.

common stock: a security representing ownership in a corporation entitling its holder to exercise control over the company affairs (e.g., via voting on electing a board of directors and corporate policy), with the lowest priority (after bondholders, preferred stockholders, etc.) for rights to the company's assets in the event of its liquidation.

compounding: reinvestment of interest earned to generate additional interest in the future.

compounding period: the period between two consecutive points in time when interest is paid or added to the principal.

conditional expectation (a.k.a. conditional expected value, or conditional mean): an average value of a quantity assuming some condition occurs.

conditional independence: A and B are conditionally independent assuming C is true iff the occurrence of A assuming C is independent from the occurrence of B assuming C and vice versa, i.e., $P(A \cap B | C) = P(A | C) \times P(B | C)$, where $P(A | B)$ is a conditional probability.

conditional probability: $P(A|B)$, the probability of A occurring assuming B is true.

condor: a type of options strategies.

constrained regression: a linear regression subject to a set of linear or non-linear constraints, e.g., non-negative least squares (NNLS), where the regression coefficients are required to be nonnegative.

Consumer Price Index (CPI): a measure of the price level of a market basket of consumer goods and services.

contango: when the futures curve (term structure) is upward-sloping.

contingent leg: in a CDO, the default leg, the other leg being the premium leg.

continuous compounding: an idealized mathematical limit of compounding where the number of compounding periods n goes to infinity, the length δ of each compounding period goes to zero, and the product $n \times \delta$ is kept fixed and finite.

contrarian effect: see *mean-reversion effect*.

control rights: the legal entitlements granted to an investor (e.g., a shareholder holding common stock), such as the right to transfer shares, receive regular and accurate financial disclosure, vote on specific issues at the company, etc.

conversion factor: the quoted price a bond would have per dollar of principal on the first day of the delivery month of an interest rate futures contract assuming that the interest rate for all maturities equals 6% per annum with semiannual compounding.

conversion factor model: a model (based on the conversion factor) commonly used to calculate hedge ratios when hedging interest rate risk with interest rate futures.

conversion price: the price of the underlying stock at which a convertible bond can be converted into stock.

conversion ratio: the number of the issuer's stock shares into which a convertible bond can be converted.

convertible arbitrage: a trading strategy involving a convertible bond and stock of the same issuer.

convertible bond: a hybrid security with an embedded option to convert a bond to a preset number (conversion ratio) of the issuer's stock when, e.g., the stock price reaches a preset level (conversion price).

convexity (for bonds): a measure of non-linear dependence of bond prices on changes in interest rates, which involves the second derivative of the bond price w.r.t. the interest rates.

core inflation (CI): long run inflation, with items subject to volatile prices (such as food and energy) excluded (cf. *headline inflation*)

corporate actions: events initiated by a publicly traded company such as stock splits, dividends, mergers and acquisitions (M&A), rights issues, spin-offs, etc.

correlation: a measure of how closely two securities move in relation to each other, defined as the covariance of their returns divided by a product of the standard deviations of said returns.

correlation matrix: an $N \times N$ matrix with unit diagonal elements, whose off-diagonal elements are the pair-wise correlations of N different securities.

correlation trading: arbitraging the average pair-wise correlation of the index constituents vs. its future realized value.

counterparty: the other party that participates in a financial transaction.

coupon bond: a bond that makes periodic coupon payments before maturity.

coupon rate: an un compounded, fixed or variable rate at which a coupon bond makes coupon payments.

covariance: a mean value of the product of the deviations of the returns of

two securities from their respective mean values.

covariance matrix: an $N \times N$ matrix, whose off-diagonal elements are the pair-wise covariances of N different securities, and whose diagonal elements are the corresponding variances.

covered call: see *buy-write strategy*.

covered interest arbitrage: a trading strategy that exploits deviations from CIRP.

covered put: see *sell-write strategy*.

credit default swap (CDS): a swap that provides insurance against default on a bond.

credit derivatives: financial contracts (e.g., CDS) that allow parties to transfer or receive exposure to credit risk.

credit rating (for bonds): a measure of the creditworthiness of corporate or government bonds (e.g., S&P's credit ratings AAA, AA+, AA, AA−, A+, A, A−, BBB+, BBB, BBB−, BB+, BB, BB−, B+, B, B−, CCC+, CCC, CCC−, CC, C, D).

credit spread: the difference between the bond yield and the risk-free rate (same as the bond yield spread).

cross-border tax arbitrage: exploiting differences in the tax regimes of two or more countries.

cross-hedging: managing risk exposure to one security by taking an opposite position (with some hedge ratio) in another security (or its derivative, e.g., futures), where the two securities are positively correlated and have similar price movements.

cross-sectional quantity: a quantity (e.g., mean, standard deviation, etc.) computed across a set of securities (e.g., stocks in a portfolio) as opposed to serially (i.e., across a time series for each security).

cross-sectional regression: a regression where the independent variables are vectors whose elements are labeled by a cross-sectional index, e.g., that

which labels stocks in a portfolio (cf. *serial regression*).

cross-validation (a.k.a. out-of-sample testing): a technique to evaluate predictive models by partitioning the original data sample into a training set to train the model, and a test set to evaluate it.

cryptoassets: cryptocurrencies and similar digital assets.

cryptocurrency: a digital medium of exchange that uses cryptography (e.g., BTC).

cryptography: constructing and analyzing protocols that prevent third parties from reading private messages.

cum-dividend: when the stock buyer is entitled to receive a dividend that has been declared but not paid (cf. *ex-dividend*).

cumulative inflation: inflation rate measured from time t_1 to time t_2 (cf. *year-on-year inflation*).

cumulative return: an asset's return from time t_1 to time t_2 .

curvature: in a yield curve, the change in the slope thereof as a function of maturity.

curve-neutrality: approximate neutrality of a bond portfolio to small steepening and flattening of the yield curve.

curve trade: a flattener or steepener (in bonds or CDOs).

daily roll value: futures basis divided by the number of business days until the settlement.

dark spread: the difference between the wholesale price of electricity and the price of coal required to produce it by a coal-fired power plant.

data mining: a process of finding patterns/trends in large data sets.

debt seniority: the order of repayment of debt in the event of a sale or

bankruptcy of the debt issuer.

decentralized digital currency: a decentralized cryptocurrency such as BTC, ETH, etc.

decile: each of the 10 (approximately) equal parts of a sample (e.g., data sample).

default: a failure to repay a loan/debt.

default risk: the (estimated/perceived) risk of a default of a borrower.

deferred-month futures: a futures contract with the settlement date in the later months (cf. *front-month futures*).

delay- d backtest: a backtest in which all quantities used for establishing or liquidating simulated positions at any given time t are computed using historical quantities from times at least d trading days prior to t .

deliverable bond: a bond in the delivery basket of an interest rate futures contract.

delivery: transferring the underlying instrument (or commodity) in a contract (e.g., futures or forward) to the buyer at maturity (delivery date) at a pre-agreed price (delivery price).

delivery basket: in interest rate futures, the array of bonds that can be delivered at the delivery date.

delivery month: the month in which the delivery in a futures contract occurs.

Delta: the first derivative of the value of a derivative asset (e.g., option) w.r.t. the price of the underlying asset.

Delta-hedge: hedging a long (short) position in a derivative asset with a short (long) position in the underlying asset with the hedge ratio equal the Delta of the derivative asset.

Delta-neutral strategy: a trading strategy which achieves null Delta via, e.g., Delta-hedging.

demeaning: subtracting from the elements of a sample their mean value across said sample.

derivative (a.k.a. derivative contract, or contingent claim): a security (e.g., option) whose future payoff depends on the value of its underlying asset (e.g., stock) and is contingent on some uncertain future event.

desired holdings: portfolio holdings to be attained by a trading strategy.

detachment (a.k.a. detachment point): the percentage of the underlying portfolio loss at which a tranche of a CDO (collateralized debt obligation) loses all its value.

diagonal spread: an option trading strategy.

dimnames: a command in R for the names of column and row labels of a matrix.

directional strategy: a strategy that profits based on the underlying security's (or securities') future direction (cf. *non-directional strategy*).

discount bond (a.k.a. zero-coupon bond): a bond that pays only its principal at maturity but makes no coupon payments.

discount factor: the worth of a discount bond with \$1 principal at time t prior to its maturity T .

discount rate (a.k.a. Fed discount rate, or Federal discount rate): the interest rate charged to commercial banks and other depository institutions for loans received from the U.S. Federal Reserve.

discretionary strategy: a strategy that relies on the fund manager's skills (cf. *systematic strategy*).

discretionary macro: discretionary global macro strategies based on analysts' subjective opinions.

dispersion trading: arbitraging the index implied volatility vs. implied volatilities of its constituents.

distress risk puzzle: an empirical occurrence that companies with lower

bankruptcy risk tend to yield higher returns than riskier ones.

distressed asset: an asset (e.g., debt) of a distressed company.

distressed debt: see *distressed asset*.

distressed debt strategy: strategies based on acquiring debt of a distressed company.

distressed company: a company undergoing financial or operational distress.

distributed ledger: a database shared and synchronized across a (typically large, peer-to-peer) network encompassing multiple sites.

diversification: allocating capital to reduce exposure to any one particular asset or risk by investing in a variety of assets.

dividend: a distribution of some of the earnings of a company, as decided by its board of directors, to a class of its shareholders, usually (but not always) quarterly.

dividend imputation: a corporate tax system in which some or all of the tax paid by a company may be attributed, or imputed, to the shareholders via a tax credit to reduce the income tax payable on a distribution via, e.g., dividends.

dollar carry trade: an FX trading strategy.

dollar duration: a measure of the absolute bond price sensitivity to changes in the interest rates, defined as the modified duration times the bond price.

dollar-duration-neutrality: when the sum of dollar durations of a bond portfolio is null (with dollar durations of short bond positions defined to be negative).

dollar holding (a.k.a. dollar position): the dollar value of an asset's position in a portfolio.

dollar-neutrality: when the sum of dollar holdings in a portfolio is null (with dollar holdings of short positions defined to be negative).

domestic currency: the currency of the investor's home country.

Donchian Channel: a commonly used definition of a channel in channel trading strategies.

double-taxation: a corporate taxation system (e.g., in the U.S.) where the corporate income is first taxed at the corporate level, and then again when dividends are received by the shareholders.

downside risk: the risk associated with losses.

drawdown: a peak-to-trough decline in the P&L during a given period, where the peak (trough) is defined as the P&L maximum (minimum) in said period.

drift: a mean change in a time-dependent quantity over a period of time, i.e., a serial mean.

dual-momentum sector rotation: an ETF momentum strategy.

dumb order flow (a.k.a. uninformed order flow): aggressive order flow not based on a predictive expected return.

dummy variable (a.k.a. binary variable): a predictor variable taking binary values 0 or 1 to indicate the absence or presence of some effect or belonging or not belonging to some category that may affect the outcome (e.g., if a company belongs to a given economic sector).

duration: see *dollar duration*, *Macauley duration*, *modified duration*, *risky duration*.

duration-hedging: hedging duration risk (i.e., interest rate risk) with interest rate swaps or interest rate futures.

duration-targeting strategy: a strategy (e.g., a bond ladder) that maintains an approximately constant duration by selling shorter-maturity bonds as they approach maturity and replacing them with new longer-maturity bonds.

dynamic asset allocation: frequently adjusting the asset allocations in a

portfolio according to changing market conditions.

earnings: the after-tax net income of a company.

earnings-momentum: a momentum strategy based on earnings.

economic activity: production, distribution, exchange and consumption of goods and services.

economic data: data (typically, time series) pertaining to an actual economy.

eigenvalue: a root of the characteristic equation of a matrix (see *eigenvector*).

eigenvector: for a square symmetric $N \times N$ matrix A , an N -vector V that solves the characteristic equation $A V = \lambda V$, where λ is the corresponding eigenvalue (which is a number).

electronic trading: trading securities electronically, as opposed to by human traders on the trading floors of the exchanges.

EMA: an exponential moving average, a serial moving average with past contributions suppressed with exponentially decreasing weights.

embedded option: in a convertible bond, the option to convert the bond to a preset number of the issuer's stock.

EMSD: an exponential moving standard deviation, a serial moving standard deviation with past contributions suppressed with exponentially decreasing weights.

equally-weighted portfolio: a portfolio where all assets have equal dollar holdings.

equity: a company's stock or other security representing its ownership interest.

equity market: a stock market.

equity tranche: the lowest quality tranche of a CDO.

eRank (a.k.a. effective rank): a measure of effective dimensionality of a

matrix.

error function: in machine learning, a function to be minimized that is constructed from the errors (or similar), e.g., the sum of squares of the errors, or some other suitable function (not to be confused with the Gauss error function $\text{erf}(x)$).

establishing: buying or shorting an asset or portfolio from a null position.

estimation period: the length of a time-series data sample used in estimating some parameters, e.g., regression coefficients.

ETH: ether/Ethereum, a cryptocurrency.

Euclidean distance: the distance between two vectors defined as the square root of the sum of squares of the differences between their components.

EUR: euro, a unit of the eurozone currency.

eurodollar: a USD deposit held in a bank outside the U.S.

European call option: a right (but not an obligation) to buy a stock at the maturity time T for the strike price k agreed on at time $t = 0$.

European put option: a right (but not an obligation) to sell a stock at the maturity time T for the strike price k agreed on at time $t = 0$.

ex-dividend when the stock seller is entitled to receive a dividend that has been declared but not paid (cf. *cum-dividend*).

excess return: a return of an asset in excess of some benchmark return (e.g., risk-free rate).

exchange rate (a.k.a. FX rate): the rate of exchange between two different currencies.

execution price: the price at which an order (e.g., to buy stock) is filled (executed).

exercise date: a date on which an option can be exercised.

exotic options: a broad category of options that typically are complexly structured.

expected return: a future return of an asset expected based on some reasonable consideration, e.g., an average realized return over some past period.

expiration: the last date on which a derivatives contract (e.g., option or futures) is valid.

explanatory variable: a variable that has (or is expected to have) some explanatory power for an observed variable (e.g., hours studied by a student for a final exam can be expected to be an explanatory variable for the student's final exam grade/score).

exponential smoothing parameter: the exponential suppression factor in an exponential moving average.

exposure: the amount that can be lost (or gained) in an investment.

face value (a.k.a. principal): the amount paid to the bondholder at maturity.

factor (a.k.a. risk factor): a common explanatory variable for a cross-section of asset returns (e.g., stocks).

factor loadings matrix: the $N \times K$ matrix Ω_{iA} ($i = 1, \dots, N$, $A = 1, \dots, K$, typically $K \ll N$) in a K -factor model $Y_i = \sum_{A=1}^K \Omega_{iA} F_A + \epsilon_i$, where Y_i are the observed variables, F_A are the unobserved variables (common factors), and ϵ_i are the unobserved error terms.

factor portfolio: a portfolio that aims to attain exposure to a given factor.

fair value: a market value of a security or, in the absence of a market value, a theoretical value based on some reasonable modeling.

Fama-French factors: MKT, the excess return (defined as the return in excess of the risk-free rate, in turn defined as the one-month Treasury bill rate) of the market portfolio; SMB, the excess return of the Small minus Big (by market capitalization) portfolio; HML, the excess return of the High minus

Low (by book-to-market) portfolio.

Fama puzzle: see *forward discount anomaly*.

feature (in machine learning): a predictor, an input variable.

fiat currency: a legal tender declared by a government (e.g., U.S. dollar) but not backed by a physical commodity (such as gold).

fill: when an order to buy or sell a security or commodity is completed, with a partial completion (e.g., only 100 shares of a 200 share buy order are filled) known as a partial fill.

fill or kill limit order (a.k.a. FOK): a limit order to buy or sell stock that must be executed immediately and completely or not at all (no partial fills are allowed).

financial crisis: when some financial assets suddenly lose a large part of their nominal value.

first-month contract: see *front-month futures*.

fix-and-flip: a real estate strategy.

fixed coupon bond (a.k.a. fixed rate coupon bond): a bond with a fixed (as opposed to variable) coupon rate.

fixed-income asset: a debt instrument that generates fixed returns in the form of interest payments.

fixed interest rate (a.k.a. fixed rate): an interest rate on a liability that remains unchanged either for the entire term of the loan or for its part.

fixed rate payment: a coupon payment of a fixed coupon bond.

flattener: a yield curve spread bond strategy.

floating coupon bond (a.k.a. floating rate coupon bond, or variable coupon bond, or variable rate coupon bond): a bond with a variable

(as opposed to fixed) coupon rate.

floating interest rate (a.k.a. floating rate, or variable interest rate, or variable rate): interest rate on a liability that varies during the term of the loan.

floating rate payment: a coupon payment of a floating coupon bond.

FOMC announcements: Federal Open Market Committee announcements such as interest rate hikes.

forecasting future returns: predicting future returns.

foreign currency: a currency (that is different from the domestic currency) of a country other than the investor's home country.

formation period: in momentum strategies, the period over which the momentum indicator is computed.

forward (a.k.a. forward contract): a contract struck at time $t = 0$, where one of the two parties agrees to sell the other an asset at some future time T (known as the expiry, delivery date or maturity of the contract) for the pre-agreed strike price k .

forward discount: when the forward FX rate is lower than the spot FX rate.

forward discount anomaly (a.k.a. forward premium anomaly, or forward discount puzzle, or forward premium puzzle, or Fama puzzle): an empirical occurrence whereby on average high interest rate currencies tend to appreciate (somewhat) w.r.t. low interest rate currencies.

forward FX rate: the FX rate of a forward FX contract.

forward premium: when the forward FX rate is higher than the spot FX rate.

front leg: shorter-maturity bonds in a yield curve spread strategy (flattener or steepener).

front-month futures: a futures contract with the settlement date closest to the current date (cf. *deferred-month futures*).

fundamental analysis: evaluating securities based on fundamental data.

fundamental data: data pertaining to the fundamentals of stocks or other securities, including time series and/or cross-sectional data.

fundamental industry classification: an industry classification of companies (into sectors, industries, sub-industries, etc.) based on fundamental/economic data, such as companies' products and services, revenue sources, suppliers, competitors, partners, etc. (cf. *statistical industry classification*).

fundamental trading strategy: a trading strategy based on fundamental analysis.

fundamentals: quantitative and qualitative information on the financial/economic health and valuation of a company, security, currency, etc.

futures (a.k.a. futures contract): a standardized forward contract traded on a futures exchange.

futures basis: the futures price minus the underlying spot price.

futures curve (a.k.a. futures term structure): the dependence of the futures prices on time to delivery.

futures delivery basket: see *delivery basket*.

futures spread: see *calendar spread (for futures)*.

FX pair: currencies of 2 different countries.

FX rate: see *exchange rate*.

FX rate risk: exposure to FX rate changes.

FX spot rate: see *spot FX rate*.

FX triangular arbitrage: arbitraging 3 FX pairs.

Gamma: the second derivative of the value of a derivative asset (e.g., option) w.r.t. the price of the underlying asset.

Gamma hedging: an options hedging strategy to eliminate or reduce the

exposure caused by changes in an option portfolio's Delta as a result of the underlying security's price movements.

Gamma scalping: Gamma hedging by buying and selling the underlying security in response to its price movements that cause changes in an option portfolio's Delta.

global macro: trading strategies seeking to capitalize on regional, economic and political changes around the world.

Greeks: see *Delta, Gamma, Theta, Vega*.

greenfield project: a project associated with infrastructure assets to be constructed.

guaranteed loan: a loan guaranteed by a third party in case the borrower defaults.

guts: an option trading strategy.

hard-to-borrow security: a security on a "Hard-to-Borrow List", an inventory record used by brokerages for securities that are difficult to borrow for short sale transactions due to short supply or high volatility.

headline inflation (HI): a measure of the total inflation within an economy, including commodity prices such as food and energy (cf. *core inflation*).

heat rate: the efficiency with which an electricity production plant converts fuel into electricity.

hedge: an investment (typically, via an offsetting position in a related security) to reduce the risk of losing money on an existing position.

hedge ratio: in a hedge, the number of units (or the dollar notional) of the offsetting security for each unit (or dollar) of the security to be hedged.

hedger: a market participant attempting to reduce risk associated with a security's price movement (cf. *speculator*).

hedging pressure (HP): in (commodities) futures markets, the number

of long contracts divided by the total number of contracts (long plus short).

hedging strategy: see *hedge*.

heterotic risk model: a multifactor risk model combining a multilevel fundamental industry classification with principal component analysis.

hidden layers: in an artificial neural network, the intermediate layers of nodes (artificial neurons) between the input layer and the output layer.

high (a.k.a. high price): the maximum price attained by a stock (or other security) within a given trading day (or some other time interval).

high-minus-low carry: an FX trading strategy based on the forward discount anomaly.

High Yield bonds (a.k.a. junk bonds): bonds with S&P credit ratings below BBB-.

historical quantity: a quantity (e.g., correlation, variance, volatility, return, etc.) computed based on historical data.

HMD (a.k.a. healthy-minus-distressed): buying the safest companies and selling the riskiest ones by probability of bankruptcy.

HML (a.k.a. High minus Low): see *Fama-French factors*.

Hodrick-Prescott filter (a.k.a. HP filter, or Whittaker-Henderson method in actuarial sciences): a time-series filter for separating a lower-frequency (“regular”) component from a higher-frequency (“irregular”) component (noise).

holding period: the period for which a position in a security or a portfolio is held after being established and before being liquidated (or, more loosely, rebalanced).

holding weights: the weights with which assets are held in a portfolio.

holdings: the contents of a portfolio; also, a shorthand for, e.g., dollar holdings.

horizon (a.k.a. investment horizon): see *holding period*.

horizontal spread (a.k.a. time spread): see *calendar spread*.

Hybrid Market: a blend of an automated electronic trading platform and a traditional (human-operated) floor broker system.

hybrid security: a security with mixed characteristics of two asset classes, e.g., a convertible bond.

IBS: internal bar strength, defined as the difference between the close price and the low price divided by the difference between the high price and the low price.

implied volatility: in option pricing, the volatility of the underlying instrument, which, when used as an input in an option pricing model (such as the Black-Scholes model), yields the model value of the option price equal to its market value.

imputation system: see *dividend imputation*.

in-sample: when a computation or backtest is not out-of-sample.

in-the-money (ITM) option: a call (put) option whose exercise price is below (above) the current price of the underlying asset.

income strategy: a trading strategy that generates income, usually via some risk exposure.

incomplete basket: a subset of the portfolio that would ideally be traded, e.g., in index arbitrage.

index: a diversified portfolio of assets combined with some weights.

index arbitrage (a.k.a. cash-and-carry arbitrage): an arbitrage strategy exploiting mispricings between the index spot price and index futures price (i.e., the index futures basis).

index basket: an index portfolio.

index constituents: the assets in an index portfolio.

index ETF: an ETF that tracks an index.

index futures: a futures on an index.

index hedging: hedging a position (e.g., a CDO tranche) with a pertinent index.

index level: for market cap weighted indexes, the current value of the index level $I(t) = I(0) \times C(t)/C(0)$, where $I(0)$ is the initial value of the index level (which is defined, not calculated), $C(t)$ is the current total market cap of the index constituents, and $C(0)$ is its initial value.

index spot price: the current market price of an index basket, where the number of units of each constituent is determined by the index weighting scheme (market cap weighted index, price weighted index, etc.) with the overall normalization constant fixed depending on a specific purpose, e.g., to match the index portfolio to be delivered at the index futures delivery in the case of index arbitrage.

indexed payments: payments adjusted according to the value of some index, e.g., CPI in inflation swaps or TIPS.

industrial properties: commercial real estate properties including manufacturing buildings and property, warehouses, etc.

industry (in economy): a group of companies that are related based on their primary business activities.

industry (in industry classification): a grouping of companies based (among other things) on which economic industry they belong to.

industry classification: a taxonomy of companies (stocks) based on some similarity criterion (or criteria), e.g., a company's main source of revenues, how closely stock returns follow each other historically, etc.

inflation: a sustained increase in the price level of goods and services in an economy over a period of time, which is measured as an annual percentage change known as the inflation rate.

inflation hedge: a hedge against inflation.

inflation index: e.g., CPI.

inflation-indexed product: a security (e.g., TIPS) with indexed payments based on an inflation index.

inflation swap: a swap whose buyer is long the inflation and receives a floating rate (based on an inflation index) and pays a fixed rate (breakeven rate).

informed order flow: see *smart order flow*.

infrastructure funds: unlisted infrastructure funds (private equity-type investments), listed infrastructure funds (exchange-traded).

infrastructure investment: investing in long-term projects such as transportation (roads, bridges, tunnels, railways, ports, airports, etc.), telecommunications (transmission cables, satellites, towers, etc.), utilities (electricity generation, gas or electricity transmission or distribution, water supply, sewage, waste, etc.), energy (including but not limited to renewable energy), healthcare (hospitals, clinics, senior homes, etc.), educational facilities (schools, universities, research institutes, etc.), etc.

input layer: in an artificial neural network, the layer of nodes (artificial neurons) that processes the input data.

institutional trader: a trader who buys and sells securities for an account of a group or institution such as a pension fund, mutual fund, insurance company, ETF, etc.

integration: the final step of the money laundering process whereby money launderers get back the money via legitimate-looking sources.

intercept: in a linear regression, the regression coefficient of the independent variable (which is also colloquially referred to as the intercept) whose elements are all equal 1.

interest: the amount paid by the borrower to the lender above the principal (the actual amount borrowed).

interest rate: the interest per \$1 of the principal.

interest rate futures: a futures contract typically with an array (delivery basket) of underlying instruments (e.g., bonds) that pay interest.

interest rate risk (a.k.a. interest rate exposure): the exposure to interest rate fluctuations, which affect bond and other fixed-income asset prices.

interest rate spread: the difference between the interest rates paid by two instruments.

interest rate swap: a contract that exchanges a stream of floating rate payments for a stream of fixed rate payments or vice versa.

intra-asset diversification: in real estate investments, diversification by property type (residential, commercial, etc.), economic diversification (by different regions divided according to economic characteristics), geographic diversification, etc.

intraday arbitrage: taking advantage of intraday mispricings, e.g., in ETFs and stocks.

intraday signal: a trading signal used by an intraday strategy.

intraday strategy: a trading strategy that starts with a null position, buys and sells/shorts securities intraday, and ends with a null position by the close (in trader lingo, “goes home flat”).

inverse ETF: an ETF designed to track the return inverse to its underlying index.

inverse matrix: for an $N \times N$ square matrix A , the inverse matrix A^{-1} is the $N \times N$ square matrix such that $A A^{-1} = A^{-1} A = I$, where I is the $N \times N$ identity matrix (whose diagonal elements equal 1, and off-diagonal elements equal 0).

investment: allocating money with an expectation of a positive return.

Investment Grade bonds (a.k.a. IG bonds): bonds with S&P credit ratings AAA through AA- (high credit quality) and A+ through BBB- (medium

credit quality).

investment vehicle: an investment product (e.g., ETF) used by investors for generating positive returns.

iron butterfly: a type of option trading strategies.

iron condor: a type of option trading strategies.

iShares (ticker IVV): an S&P 500 tracking EFT.

Jensen's alpha: an abnormal return of a security or portfolio, usually calculated as the intercept coefficient in a linear model, where excess returns of said security or portfolio are serially regressed over excess returns of one or more factor portfolios (e.g., MKT).

Joule: a unit of work, heat and energy in the International System of Units (SI).

JPY: Japanese Yen, a unit of Japanese currency.

junior mezzanine tranche: the next (by increasing quality) tranche of a CDO after the equity tranche.

k-nearest neighbor algorithm (a.k.a. KNN or k-NN): a statistical classification algorithm based on a similarity criterion such as distance, angle, etc., between multi-dimensional vectors.

Kalman filter: a time-series filter for separating signal from noise.

Kelly strategy: an allocation (betting) strategy based on maximizing the expectation of the logarithm of wealth.

keyword: in sentiment analysis (e.g., Twitter sentiment) using machine learning techniques, a word in the learning vocabulary pertinent to the goal (e.g., predicting stock or cryptocurrency price movements).

ladder (for bonds): a bond portfolio with (roughly) equal capital allocations into bonds of a sizable number of different (and usually approximately equidistant) maturities.

ladder (for options): a vertical spread consisting of 3 options, all 3 are

call options or put options, 2 are long and 1 is short, or 1 is long and 2 are short.

Lagrange multiplier: when minimizing a (multivariate) function $g(x)$ w.r.t. x subject to a constraint $h(x) = 0$, an additional variable λ in the function $\tilde{g}(x, \lambda) = g(x) + \lambda h(x)$, whose (unconstrained) minimization w.r.t. x and λ is equivalent to the original constrained minimization problem.

layer: see *input layer, output layer, hidden layer*.

layering: the middle step in the money laundering process, which amounts to moving the money around between different accounts and even countries thereby creating complexity and separating the money from its source by several degrees.

learning vocabulary: in sentiment analysis (e.g., Twitter sentiment) using machine learning techniques, a set of keywords pertinent to the goal (e.g., predicting stock or cryptocurrency price movements).

least squares: in regression analysis, minimizing the sum of squares of the residuals (possibly, with nonuniform weights).

ledger: a book or other collection of financial accounts and transaction records.

leg: a component in a trading portfolio, usually when a portfolio can be thought of as consisting of a relatively small number of groupings (e.g., short leg and long leg, referring to short and long positions, respectively).

LETF: leveraged (inverse) ETF, an ETF designed to track the return (inverse to) n times the return of its underlying index, where n is the leverage (usually, 2 or 3).

leverage: using borrowed funds to purchase an asset.

limit order: an order to buy or sell a stock (or other security) at a specified price or better.

linear homogeneous constraint: for an N -vector x_i ($i = 1, \dots, N$), a constraint of the form $\sum_{i=1}^N a_i x_i = 0$, where at least some a_i are nonzero.

linear regression (a.k.a. linear model): fitting data for the observable variable using a linear combination of some number of (linear or nonlinear) functions of independent variables, with or without the intercept.

liquid asset: an asset that can be converted into cash quickly with minimal transaction costs.

liquid U.S. stocks: a subset of U.S. listed stocks usually defined using ADDV and market cap filters (e.g., top 2,000 most liquid stocks by ADDV).

liquidation (for assets or portfolios): closing of the open positions.

liquidation (for companies): winding up (bringing to an end) a company's business and distributing its assets to claimants, usually when the company is insolvent.

liquidity: availability of liquid assets/funds.

loadings matrix: see *factor loadings matrix*.

loan: lending of money or another asset by one party (lender) to another (borrower).

loan shark: a lender offering a loan at excessively high interest rates.

loan-to-own strategy: financing a distressed company via secured loans with the view of obtaining equity with control rights if the company files for bankruptcy.

log: a logarithm (usually, unless specified otherwise, the natural logarithm).

log-return: the natural log of the ratio of an asset's price at time t_2 to its price at time t_1 ($t_2 > t_1$).

log-volatility: a standard deviation of the natural logarithms of prices.

logistic regression (a.k.a. logit model): a statistical model typically applied to a binary dependent variable.

long-only: a portfolio or strategy with only long holdings.

long-run mean: in a mean-reverting Ornstein-Uhlenbeck process, the mean

value of the state variable in the infinite time limit.

long-short: a portfolio or strategy with both long and short holdings.

lookback (a.k.a. lookback period): the length of a time-series data sample used in a backtest or historical computation.

losers: stocks or other assets in a portfolio or trading universe that underperform based on some criterion (benchmark).

low (a.k.a. low price): the minimum price attained by a stock (or other security) within a given trading day (or some other time interval).

low-volatility anomaly: an empirical occurrence that future returns of previously low-return-volatility portfolios outperform those of previously high-return-volatility portfolios.

Macaulay duration: a weighted average maturity of a bond's cash flows, where the weights are the present values of said cash flows.

machine learning (ML): a method of data analysis that automates predictive analytical model building based on the premise that computational systems can “learn” from data, identify patterns and make decisions with minimal human intervention.

macro: macro trading strategies.

Manhattan distance: the distance between two vectors defined as the sum of the absolute values of the differences between their components.

margin account: a brokerage account in which the broker lends the customer cash to purchase securities.

mark-to-market (MTM): valuing assets or portfolios based on the most recent pertinent market prices.

market: a medium that allows buyers and sellers to interact to facilitate an exchange of securities, commodities, goods, services, etc.

market beta: a measure of the volatility (systematic risk) of an asset or portfolio in comparison to the broad market.

market capitalization (a.k.a. market cap, or cap): the market value of a company's shares outstanding.

market crash: a sudden dramatic decline of asset prices across their significant cross-section.

market data: price and trade-related data for a financial security reported by a trading exchange (or similar).

market-making: providing liquidity by simultaneously quoting both buy and sell prices in a financial instrument or commodity held in inventory with the view of making a profit on the bid-ask spread.

married call: see *protective call*.

married put: see *protective put*.

maturity (a.k.a. maturity date, or maturity time): the time at which a financial instrument will cease to exist and any principal and/or interest are repaid in full.

mean: an average value.

mean-reversion effect (a.k.a. mean-reversion, or contrarian effect): a tendency of asset prices and/or their returns to revert to their mean values, which mean values can be serial and/or cross-sectional, depending on the context.

mean-reversion parameter: in a mean-reverting Ornstein-Uhlenbeck process, the parameter that controls the rate of mean-reversion.

mean-reversion strategy: a trading strategy based on a mean-reversion effect.

mean-variance optimization: an optimization technique for constructing a portfolio of assets such that its expected return is maximized for a given level of its risk.

Megawatt: 1,000,000 watts.

Megawatt hour (Mwh): 1,000,000 watts times 1 hour, which equals 3.6×10^9 Joules.

merger: a consolidation of two companies into one.

merger arbitrage (a.k.a. risk arbitrage): a trading strategy that attempts to capture excess returns generated via corporate actions such as mergers and acquisitions (M&A).

metropolitan statistical area (MSA): a core area containing a substantial population nucleus, together with adjacent communities having a high degree of economic and social integration with that core.

mini-S&P futures (a.k.a. e-mini): a futures contract on S&P 500 with the notional value of 50 times the value of the S&P 500 stock index.

mishedge: an imperfect hedge, or when a hedge becomes undone (e.g., by underlying price movements).

mispricing: an inefficiency in the pricing of a security, when its price does not match its intrinsic value or (perceived) fair value.

MKT: see *Fama-French factors*.

modified duration: a measure of the relative bond price sensitivity to changes in the interest rates, defined as the negative first derivative of the bond price w.r.t. the bond yield.

MOM: see *Carhart's momentum factor*.

momentum (a.k.a. momentum effect): an empirical occurrence whereby assets' future returns are positively correlated with their past returns.

momentum strategy: a trading strategy based on momentum.

monetary policy: usually by a central bank, a process by which the monetary authority of a country controls the size and rate of growth of the money supply, via modifying the interest rates, buying or selling government bonds, and changing the required bank reserves (the amount of money banks are required to keep in their vaults).

money laundering: an activity wherein cash is used as a vehicle to transform

illegal profits into legitimate-appearing assets.

moneyness: where a derivative contract's strike price is in relation to its underlying asset's current price, which determines the derivative's intrinsic value.

mortgage: a debt instrument, secured by a real estate property as a collateral, that the borrower is obligated to pay back with a predetermined set of payments.

mortgage-backed security (MBS): an asset backed by a pool of mortgages.

moving average (a.k.a. rolling average): in a time series, an average (possibly computed with nontrivial weights) over a time interval of fixed length (moving average length), where the most recent time in said interval can take various values in the time series.

moving standard deviation: in a time series, a standard deviation (possibly computed with nontrivial weights) over a time interval of fixed length, where the most recent time in said interval can take various values in the time series.

multi-currency arbitrage: arbitraging 4 or more FX pairs.

multifactor risk model: a risk model based on a number (which can be sizable) of risk factors.

multifactor strategy: a trading strategy based on combining exposures to multiple factors, e.g., momentum, value, etc. (multifactor portfolio).

multinomial probability distribution: a discrete probability distribution of a random variable which takes k different values with probabilities p_1, \dots, p_k .

municipal bond (a.k.a. muni bond): a bond issued by a local government/territory or its agency.

municipal bond tax arbitrage: a trading strategy based on borrowing money and buying tax-exempt municipal bonds.

mutual fund: an investment vehicle funded by a pool of money collected from many investors for the purpose of buying various securities (stocks, bonds,

money market instruments, etc.).

naked call: a stand-alone short call option.

naked put: a stand-alone put call option.

near-month contract: see *near-month futures*.

near-month futures: see *front-month futures*.

neutral curve butterfly: a bond butterfly strategy with curve-neutrality.

neutral outlook: when a trader expects the market or a security to trade around its current level.

no-risk-free-arbitrage condition: a condition that ensures that no risk-free profits can be made by a trading strategy (at least, in excess to the risk-free rate).

node: in an artificial neural network, an artificial neuron, which (using an activation function) processes a set of inputs and generates an output.

noise: in a financial time series, random fluctuations without any apparent trend.

non-announcement days: days without any important economic announcements such as FOMC announcements (cf. *announcement days*).

non-deliverable bond: a bond not in the delivery basket of an interest rate futures contract.

non-directional strategy (a.k.a. neutral strategy): a strategy not based on the underlying security's (or securities') future direction, so the trader is oblivious to whether its price goes up or down (cf. *directional strategy*).

non-discretionary strategy: a trading strategy based on a systematic approach (as opposed to discretionary).

non-systematic risk: specific (a.k.a. idiosyncratic) risk, which is specific to each company, asset, etc., and exposure to which can be reduced via diver-

sification, albeit never completely eliminated (cf. *systematic risk*).

nonlinear least squares: least squares used to fit a set of observations with a model that is nonlinear in the unknown parameters (regression coefficients).

notional (a.k.a. notional value): the total (dollar) value of a position.

objective function: a function to be maximized or minimized in optimization.

open (a.k.a. open price, or opening price): the opening price of a stock at the NYSE open (9:30 AM Eastern Time).

open interest (a.k.a. open contracts, or open commitments): the total number of open futures (or options) contracts at any given time (i.e., those contracts that have not been settled).

optimal hedge ratio: a hedge ratio calculated by minimizing the variance of a hedged portfolio.

optimization: see *portfolio optimization*.

option: a financial derivative contract that gives the buyer (option holder) the right (but not the obligation) to buy (call option) or sell (put option) the underlying asset at an agreed-upon price during a predefined period of time or on a specific date.

option-adjusted spread (OAS): a parallel shift in the Treasury curve (or some other benchmark yield curve) that matches a security's price calculated based on a pricing model to its market value, with the view to account for the security's embedded options.

option premium: the cost charged by the option seller to the option buyer.

option writer: an option seller.

order: an investor's instructions to a broker or brokerage firm to purchase or sell a security.

order execution system: a software component that executes trades based

on input buy and/or sell order sequences.

Ornstein-Uhlenbeck process: Brownian motion with mean-reversion.

orthogonality: vectors x_i and y_i ($i = 1, \dots, N$) are orthogonal if $\sum_{i=1}^N x_i y_i = 0$.

out-of-sample backtest: a backtest in which all quantities used for establishing or liquidating simulated positions corresponding to any given time t are computed using historical quantities from times prior to t .

out-of-sample computation: a computation where all quantities to be used for forecasting purposes at any given simulated time t are computed using historical quantities from times prior to t .

out-of-the-money (OTM) option: a call (put) option whose exercise price is above (below) the current price of the underlying asset.

outcome (a.k.a. class): in machine learning, one of the possible results (outputs, predictions) of a machine learning algorithm.

output gap: the difference between the actual output of an economy and its maximum potential output as a percentage of GDP.

output layer: in an artificial neural network, the layer of nodes (artificial neurons) that generates the output data (the result).

over-fitting: in a statistical model, fitting more free parameters than justified by the data, thereby (often unwittingly) essentially fitting noise and rendering the model unproductive out-of-sample.

overnight return: broadly, a return from some time during the previous trading day to some time during the current day (e.g., close-to-open return, close-to-close return); usually, close-to-open return.

overreaction: in financial markets, an irrational response by market participants (based on greed or fear) to new information.

pairs trading: a mean-reversion strategy involving two historically correlated assets.

parallel shift: in a yield curve, all interest rates for all maturities changing by the same amount.

passive investing: a longer-horizon, essentially buy-and-hold, investment strategy with the view of minimizing transaction costs and replicating the performance of a (typically, well-diversified) benchmark portfolio.

passive limit order: a liquidity-providing limit order to buy at the bid (or lower) or sell at the ask (or higher).

passive trading strategy: a trading strategy based on the passive investing approach.

passthrough MBS: an MBS where cash flows are passed from debtors to investors through an intermediary.

pawnbroker: a lender that extends a secured cash loan with pre-agreed interest and period (which can sometimes be extended), where the loan is secured with a collateral (forfeited if the borrower defaults), which is some valuable item(s), such as jewelry, electronics, vehicles, rare books or musical instruments, etc.

payment period: the period between two consecutive bond coupon payments.

payoff: the amount the option seller pays to the option buyer if and when the option is exercised.

peer-to-peer (P2P) network: a distributed computing application architecture with workload partitioned between equally privileged peers.

pension fund: a pool of funds that provides retirement income.

performance characteristics: for a portfolio or strategy, characteristics such as return-on-capital, Sharpe ratio, cents-per-share, maximum drawdown, etc.

periodic compounding: compounding with equal compounding periods, e.g., quarterly, semiannual or annual compounding.

physical commodity: the actual commodity (e.g., copper) that is delivered to a commodity futures contract buyer at the expiration.

pivot point (a.k.a. center): in support and resistance strategies, a definition-dependent quantity, e.g., defined as the equally weighted average of the previous trading day's high, low and close prices.

placed order: an order that has been submitted to an exchange and placed in a queue for execution.

placement: the initial stage in the money laundering process, whereby illegal funds are introduced into the legal economy via fraudulent means.

Porter stemming algorithm: an algorithm for reducing words to their base form (stemming).

portfolio: a collection of assets held by an institution or individual investor.

portfolio diversification: see *diversification*.

portfolio optimization: selecting the best portfolio based on some criterion (e.g., maximizing the Sharpe ratio).

portfolio weights: the relative percentages of the dollar holdings in a portfolio to its total notional value (defined as the total notional value of the long positions plus the total absolute notional value of the short positions).

position: the amount of stock or other security held, expressed in dollars, shares, or some other units, with short positions possibly having negative values depending on a convention used.

position bounds: upper or lower bounds on the dollar holdings of various assets in a portfolio.

predicted class: in machine learning, the outcome predicted by an algorithm.

predictor (a.k.a. predictor variable): in machine learning, an input variable.

premium (for insurance-type products): a periodic payment for insurance coverage, e.g., in a CDS, CDO, etc.

premium (for options): the cost of buying an option.

premium leg: the leg of a CDO corresponding to the CDO premiums, the other leg being the default leg.

prepayment: settling a debt or installment payment before its due date (e.g., mortgage prepayment).

prepayment risk: the main risk to investors in a passthrough MBS whereby homeowners have an option to prepay their mortgages (e.g., by refinancing their mortgages as the interest rates drop).

price-momentum strategy: a momentum strategy where the momentum indicator is based on past returns.

pricing data: historical and real-time data containing prices, trading volumes and related quantities (see *market data*).

pricing model: a model for valuing (pricing) a security or a set of securities.

principal: the amount the debt issuer (borrower) owes the lender at debt maturity.

principal component: for a symmetric square matrix, an eigenvector thereof normalized such that the sum of squares of its components equals 1, with different principal components ordered in the descending order by the corresponding eigenvalues.

principal component analysis (PCA): a mathematical procedure that transforms some number of (typically, correlated) variables into a (typically, smaller) number of uncorrelated variables (principal components), with the first principal component accounting for as much of the variability in the data as possible, and each succeeding principal component accounting for as much of the remaining variability as possible.

probability distribution: a function that provides the probabilities of occurrence of different possible outcomes.

probability measure: a real function valued in the interval between 0 and 1 (0 corresponding to the empty set and 1 corresponding to the entire space) defined on a set of events in a probability space that satisfies the countable

additivity property, i.e., simply put, that the probability of a union of disjoint events A and B equals the sum of their probabilities.

protection buyer: a buyer of insurance.

protection seller: a seller of insurance.

protective call (a.k.a. married call, or synthetic put): hedging a short stock position with a long call option position.

protective put (a.k.a. married put, or synthetic call): hedging a long stock position with a long put option position.

publicly traded company (a.k.a. public company): a company whose shares are freely traded on a stock exchange or in over-the-counter markets.

put-call parity: the relationship whereby the payoff of a European call option (with a strike price K and expiration T) minus the payoff of a European put option (on the same underlying and with the same strike and expiration) equals the payoff of a forward contract (on said underlying) with the strike K and expiry T .

put option (a.k.a. put): see *European put option, option*.

quantile: each of the n (approximately) equal parts of a sample (e.g., data sample), where $n > 1$.

quantitative trading: systematic trading strategies based on quantitative analysis and mathematical computations with little to no human intervention outside of developing a strategy (which includes coding it up in a suitable computer language).

quark spread: the analog of the spark spread and the dark spread for nuclear power plants.

quintile: each of the 5 (approximately) equal parts of a sample (e.g., data sample).

R: R Package for Statistical Computing.

R-squared: in a regression, 1 minus a ratio, whose numerator is the sum of squares of the residuals, and whose denominator is the sum of squares of the deviations of the values of the observable variable from their mean value across the data sample.

rally: in financial markets, a period of sustained gains.

rank (for matrices): the maximum number of linearly independent columns of a matrix.

rank (a.k.a. ranking): the position of an element of a set after sorting it according to some criterion (with a prescription for resolving possible ties).

rate: see *interest rate, inflation*.

rating: see *credit rating*.

ratio spread: a type of options strategies.

real estate: tangible immovable assets including land, structures built on it, etc.

real estate investment trust (REIT): a company (often traded on major exchanges and thus allowing investors to take a liquid stake in real estate) that owns, operates or finances income-producing real estate.

real interest rate: interest rate adjusted for inflation.

realized P&L: the P&L on a completed trade, i.e., the P&L resulting from establishing a position and then completely liquidating it.

realized profit: see *realized P&L*.

realized return: historical return.

realized volatility: historical volatility.

rebalancing: changing the holding weights in a portfolio.

recovery rate: the percentage of the principal and accrued interest on defaulted debt that can be recovered.

rectified linear unit (ReLU): the function of x given by $\max(x, 0)$.

reference entities: in a CDS, bonds, loans, names of companies or countries, etc., on which default protection is provided.

regression: see *linear regression*.

regression coefficient: the slope of an independent variable in a linear regression.

regression residuals: the differences between the observed values and the fitted (model predicted) values of the dependent variable in a linear regression.

regression-weighted butterfly: a type of bond butterfly portfolio.

regression weights: the positive weights w_i (which need not equal 1) in the sum of squares $\sum_{i=1}^N w_i \epsilon_i^2$, whose minimization determines the regression coefficients and regression residuals ϵ_i .

reinvestment risk: the risk that the proceeds (from the coupon payments and/or principal of a bond or similar instrument) would be reinvested at a lower rate than the original investment.

relative momentum: cross-sectional momentum.

relative strength index (RSI): during a specified timeframe, the average gain of the up periods divided by the sum of the average gain of the up periods and the absolute value of the average loss of the down periods.

relative value strategy: a strategy that aims to exploit differences in the prices, returns or rates (e.g., interest rates) of related (by some criterion) securities (e.g., historically correlated stock pairs in pairs trading).

reorganization: a Court-supervised process of restructuring a company's finances in bankruptcy.

reorganization plan: a plan for reorganization of a company in bankruptcy that can be submitted (e.g., by a creditor with the view of obtaining participation in the management of the company) to Court for approval.

replication: a strategy whereby a dynamic portfolio of assets precisely replicates cash flows of another asset or portfolio.

repurchase agreement (a.k.a. REPO or repo): a cash-equivalent asset that provides immediate liquidity at a preset interest rate for a specific period of time in exchange for another asset used as a collateral.

resistance: in technical analysis, the (perceived) price level at which a rising stock price is expected to bounce back down.

retail trader: a non-professional individual trader.

reverse repurchase agreement: a REPO from the standpoint of the lender.

rich stock: a stock that is perceived to be overvalued by some criterion.

risk: the possibility that the realized return will differ from the expected return.

risk-adjusted return: return divided by volatility.

risk arbitrage: see *merger arbitrage*.

risk factor: see *factor*.

risk-free arbitrage: making profit without any risk.

risk-free asset (a.k.a. riskless asset): an asset with a certain future return, e.g., Treasury bills.

risk-free discount factor: a discount factor that uses a risk-free rate for discounting future cash flows.

risk-free probability measure (a.k.a. risk-neutral measure): a theoretical probability measure under which an asset's current price equals its future expected value discounted by a risk-free rate.

risk-free rate: the rate of return of a risk-free asset, often taken to be the one-month Treasury bill rate.

risk management: identifying, analyzing and mitigating potential risks.

risk model: a mathematical model for estimating risk (e.g., modeling a covariance matrix).

risk premia (same as risk premiums): plural of *risk premium*.

risk premium: the (expected) return in excess of the risk-free rate from an investment.

risk reversal (a.k.a. combo): a type of options strategies.

risk sentiment: investor risk tolerance in response to global economic patterns, whereby when risk is perceived as low (high), investors tend to engage in higher-risk (lower-risk) investments (a.k.a. “risk-on risk-off”).

risky duration: a weighted sum (over the payment dates) of the (discounted) differences between the notional (of a CDO tranche or similar) and expected loss for each such date, where each weight is the time from the previous payment date.

roll: in futures contracts, rebalancing futures positions, whereby when the current long (short) futures contract is about to expire, it is sold (covered) and another futures contract with longer expiration is bought (sold).

roll loss (a.k.a. contango loss): in ETNs such as VXX and VXZ consisting of VIX futures portfolios, a decay in their values (when the VIX futures curve is in contango) due to their daily rebalancing required to maintain a constant maturity.

roll value: see *daily roll value*.

roll yield: in commodity futures, positive returns from the roll generated by long (short) positions when the term structure is in backwardation (contango).

rolling down the yield curve (a.k.a. rolling down the curve): a trading strategy that amounts to buying long- or medium-term bonds from the steepest segment of the yield curve (assuming it is upward-sloping) and selling them as they approach maturity.

root mean square error (RMSE): the square root of the mean value of the squares of the differences between the predicted and observed values of a variable.

rotation: see *alpha rotation, sector momentum rotation*.

rung: in a bond ladder portfolio, the bonds of the same maturity.

Russell 3000: a market cap weighted index of the 3,000 largest U.S.-traded stocks by market cap.

S&P 500: a market cap weighted index of the 500 largest U.S. publicly traded companies by market cap.

sample correlation matrix: a correlation matrix for a set of securities computed based on the time series of their historical returns.

sample covariance matrix: a covariance matrix for a set of securities computed based on the time series of their historical returns.

sample variance: a variance computed based on the time series of a security's historical returns.

scale invariance: a function $f(x_i)$ of N variables x_i ($i = 1, \dots, N$) is scale invariant if $f(\zeta x_i) = f(x_i)$ for an arbitrary scale factor ζ taking values in a continuous interval (e.g., positive real values).

seagull spread: a type of options strategies.

second-month futures: a futures contract with the nearest expiration after the front-month futures.

sector (in economy): an area of the economy in which businesses share similar products or services.

sector (in industry classification): usually, the least granular level in a multilevel industry classification (e.g., sectors are split into industries, industries are split into sub-industries).

sector momentum rotation: a type of momentum strategy for ETFs.

secured loan: a loan secured with a collateral.

security: in finance, usually a fungible, negotiable financial instrument with monetary value.

selectivity: a quantitative measure of active management of mutual funds (as well as actively-managed ETFs).

sell-write strategy: shorting stock and writing (selling) a put option against the stock position.

senior mezzanine tranche: the next (by increasing quality) tranche of a CDO after the junior mezzanine tranche.

senior tranche: the next (by increasing quality) tranche of a CDO after the senior mezzanine tranche.

sentiment analysis (a.k.a. opinion mining): the use of natural language processing and other computational techniques to extract information from (electronic) documents (e.g., tweets) pertinent to a security, e.g., for forecasting the direction of its price movements.

sentiment data: the textual data used in sentiment analysis (e.g., the contents of tweets).

Separate Trading of Registered Interest and Principal of Securities (a.k.a. STRIPS): zero-coupon Treasury securities.

serial correlation: a pair-wise correlation between two securities computed based on their time series of historical returns.

serial quantity: a quantity (e.g., mean, standard deviation, etc.) computed serially (i.e., across the time series for each security) as opposed to cross-sectionally (i.e., across a set of securities).

serial regression: a regression where the independent variables are time series (cf. *cross-sectional regression*).

settlement: the fulfillment of the obligations under a futures or forward contract at expiration.

share: a unit of ownership interest in a corporation or financial asset.

shareholder (a.k.a. stockholder): an owner of shares in a company.

shares outstanding: the total number of a company's shares held by all its shareholders.

Sharpe ratio: (excess) return divided by volatility.

short position (a.k.a. short): selling an asset without owning it by borrowing it from someone else, typically, a brokerage firm.

short-sale (a.k.a. short-selling, or shorting): establishing a short position.

sideways market: when prices remain in a tight range, without clear up or down trends.

sideways strategy: a trading strategy that aims to capitalize on an expected low volatility environment, e.g., by selling volatility.

sigmoid: the function of x given by $1/(1 + \exp(-x))$.

signal: a trading signal, e.g., to buy (buy signal) or sell (sell signal) a security.

simple moving average (SMA): a moving average without suppressing past contributions (cf. *exponential moving average*).

simple moving standard deviation: a moving standard deviation without suppressing past contributions (cf. *exponential moving standard deviation*).

single-name CDS: a CDS on a single reference entity.

single-stock option: an option on a single underlying stock (as opposed to, e.g., an option on a portfolio of stocks such as an index).

single-stock strategy: a trading strategy that derives a trading signal for any given stock using data for only that stock and no other stocks.

skewness: a measure of asymmetry in a probability distribution, defined as the mean value of the cubic power of the deviation from the mean divided by the cubic power of the standard deviation.

skewness premium: in commodity futures, an empirical occurrence whereby future expected returns tend to be negatively correlated with the skewness of historical returns.

skip period: in price-momentum and similar strategies, the period (usually, the last 1 month) skipped before the formation period (usually the last 12 months prior to the skip period).

slippage: the difference between the price at which an (initial) order is placed (or expected/hoped to be executed) and at which it is filled (including after cancel-replacing the initial order when chasing the bid or ask with buy or sell limit orders, respectively), sometimes averaged over multiple orders (e.g., when a large order is broken up into smaller ones).

smart order flow (a.k.a. toxic order flow): order flow based on some predictive expected return.

SMB (a.k.a. Small minus Big): see *Fama-French factors*.

social media sentiment: the sentiment on stocks or other securities extracted from social media posts or messages (e.g., on Twitter).

softmax: the function $\exp(x_i) / \sum_{j=1}^N \exp(x_j)$ of an N -vector x_i ($i = 1, \dots, N$).

sorting: organizing a set in an ascending or descending order based on some quantity (with a prescription for resolving possible ties).

source code (a.k.a. code): computer code written in some computer programming language.

sovereign risk: the risk that a government could default on its debt (sovereign debt, e.g., government-issued bonds) or other obligations, or that changes in a central bank's policy may adversely affect FX contracts.

spark spread: the difference between the wholesale price of electricity and the price of natural gas required to produce it.

SPDR Trust (ticker SPY): an S&P 500 tracking EFT.

specialist system: a (largely) human-controlled and operated market-making system at NYSE prior to switching to (mostly) electronic trading.

specific risk (a.k.a. idiosyncratic risk): see *non-systematic risk*.

speculative asset: an asset with little to no intrinsic value.

speculative bubble: see *bubble*.

speculator: a market participant attempting to profit from a security's price movement (cf. *hedger*).

spike: a relatively large upward or downward movement of a security's price in a short period of time.

split (a.k.a. stock split): a corporate action in which a company divides its existing shares into multiple shares (forward stock split) or combines multiple shares into one (reverse stock split).

spot (a.k.a. spot price, or spot value): the current price of an asset.

spot FX rate (a.k.a. FX spot rate, or spot rate): the current FX rate.

spread: the difference between two quantities, or a portfolio consisting of two (or more) legs comprised of the same type of assets different only by one or more specific quantities (e.g., strike price, or strike price and expiration).

standard deviation: the square root of the variance.

standardized unexpected earnings (SUE): a ratio, whose numerator (unexpected earnings) is the difference between the most recently announced quarterly earnings per share and those announced 4 quarters ago, and whose denominator is the standard deviation of the unexpected earnings over the last 8 quarters.

state variable: one of a set of variables (which may or may not be observable) used to describe a dynamical system.

statistical arbitrage (a.k.a. Stat Arb, or StatArb): typically, shorter-horizon trading strategies with sizable trading universes (e.g., a few thousand stocks) based on complex cross-sectional (and serial) statistical mean-reversion signals.

statistical industry classification: a multilevel clustering of companies based on purely statistical techniques, e.g., distance-based clustering of the companies' returns (cf. *fundamental industry classification*).

statistical risk model: a risk model built using only the pricing data (e.g., using principal components of the sample correlation matrix of stock returns), without any reference to fundamental data (including any fundamental industry classification).

steepener: a yield curve spread bond strategy.

stemming: reducing a word to its base form, the part of a word that is common to all its inflected variants.

stemming algorithm: see *Porter stemming algorithm*.

stochastic dynamics: see *stochastic process*.

stochastic gradient descent (SGD): an iterative method for optimizing a differentiable objective function.

stochastic process: a collection of random variables that change with time.

stock: a security representing fractional ownership in a corporation.

stock merger: a merger where each share of the target company is swapped for some number (which can be fractional) of the acquirer company's shares.

stop-loss price: the price of an asset at which a position in said asset is (automatically) liquidated.

stop-word: the most commonly used words in a language (e.g., "the", "is", "in", "which", etc.) that add no value in a particular context and are ignored by a natural language processing tool.

straddle: an option trading strategy.

strangle: an option trading strategy.

strap: an option trading strategy.

strategy: see *trading strategy*.

strike price (a.k.a. strike): the price at which a derivative contract can be exercised.

strip: an option trading strategy.

structured asset: a complexly structured (debt) instrument such as a CDO or ABS.

style risk factor (a.k.a. style factor): risk factors such as value, growth, size, momentum, liquidity and volatility.

sub-industry (in industry classification): usually, a subgroup of companies within the same industry grouped together based on a more granular criterion.

super senior tranche: the highest quality tranche of a CDO.

support: in technical analysis, the (perceived) price level at which a falling stock price is expected to bounce back up.

support and resistance strategy: a technical analysis strategy based on support and resistance.

support vector machine (SVM): in machine learning, a type of supervised learning models.

swap (a.k.a. swap agreement, or swap contract): a derivative contract through which two parties exchange financial instruments.

swap spread: the difference between the fixed rate of an interest rate swap and the yield on a Treasury security with a similar maturity.

swap-spread arbitrage: a dollar-neutral strategy consisting of a long (short) position in an interest rate swap and a short (long) position in a Treasury bond with the same maturity as the swap.

synthetic security (a.k.a. synthetic): a financial instrument created (via a portfolio of assets) to replicate (or approximately reproduce) the same cash flows as another security (e.g., synthetic put, call, straddle, forward, futures, etc.).

systematic approach: methodical, rules-based trading strategies with well-defined trade goals and risk controls (as opposed to, e.g., analysts' subjective opinions).

systematic macro: non-discretionary, systematic macro trading strategies.

systematic risk: non-diversifiable risk inherent to the entire market or its segment, such as exposure to broad market movements, which cannot be diversified away in long-only portfolios, but can nonetheless be substantially reduced or even essentially eliminated in long-short (e.g., dollar-neutral) portfolios.

tactical asset allocation: a dynamic investment strategy that actively adjusts a portfolio's asset allocation weights.

tanh: hyperbolic tangent.

target company: the company chosen by the acquirer company for a potential corporate merger or acquisition.

target variable: in machine learning, the variable whose values are to be modeled and predicted.

tax arbitrage: profiting from differences in how income, capital gains, transactions, etc., are taxed.

tax credit: see *dividend imputation*.

tax-exempt municipal bonds: e.g., municipal bonds that are not subject to Federal income taxes (on the interest earned) in the U.S.

tax shield: the reduction in income taxes that results from taking an allowable deduction from taxable income.

technical analysis: a methodology for forecasting the direction of prices using historical market data, primarily price and volume (cf. *fundamental analysis*).

technical indicator: a mathematical quantity used in technical analysis.

tercile: each of the 3 (approximately) equal parts of a sample (e.g., data sample).

term spread: an interest rate spread corresponding to two different maturities.

term structure (in futures): the dependence of futures prices on time to maturity.

term structure (in interest rates): see *yield curve*.

Theta: the first derivative of the value of a derivative asset (e.g., option) w.r.t. time.

Theta-decay: the time decay of an option's (or other asset's) value as time nears the expiration.

ticker (a.k.a. ticker symbol): a short character string representing a particular publicly traded security.

time series: a series of data points indexed in time order, i.e., labeled by time values.

time-to-maturity (TTM): time left before an option expires.

TIPS-Treasury arbitrage: a trading strategy consisting of selling a T-bond and offsetting the short position by a lower-cost replicating portfolio consisting of TIPS, inflation swaps and STRIPS.

Treasury Inflation-Protected Securities (TIPS): Treasury securities that pay semiannual fixed coupons at a fixed rate, but the coupon payments (and principal) are adjusted based on inflation.

tracking error: the square root of the variance of the differences between the returns of a portfolio and those of the benchmark or index said portfolio is meant to mimic or beat.

tracking ETF: an ETF that tracks an index.

trader: a person who buys and sells goods, currency, stocks, commodities, etc.

trading bounds: upper or lower bounds on the dollar amounts of allowed trades for various assets in a portfolio, when establishing, rebalancing or liquidating.

trading on economic announcements: a trading strategy that buys stocks on important announcement days, such as FOMC announcements, while holding risk-free assets on other days.

trading costs (a.k.a. transaction costs): costs associated with trading securities, including (as applicable) exchange fees, brokerage fees, SEC fees, slip-page, etc.

trading days: usually, the days on which NYSE is open.

trading rule: a set of buy and sell instructions, with the quantities of the assets to be bought or sold.

trading signal: see *signal*.

trading strategy: a set of instructions to achieve certain asset holdings by some predefined times t_1, t_2, \dots , which holdings can (but need not) be null at one or more of these times.

trading universe (a.k.a. universe): the tickers of stocks (or other securities) in a trading portfolio.

traditional assets: stocks, bonds, cash, real estate and, in some cases, also currencies and commodities.

training: in machine learning, fixing free parameters in an algorithm using training data.

training data (a.k.a. training dataset): in machine learning, a set of input-output pairs known in advance, which are used to train a machine learning algorithm.

training period: in machine learning, the period spanned by the training data when it is a time series.

tranche: see *CDO tranche*.

Treasuries: Treasury securities.

Treasury: the U.S. Department of Treasury.

Treasury bill (a.k.a. T-bill): a short-term debt obligation issued by the U.S. Treasury with maturity under 1 year.

Treasury bond (a.k.a. T-bond): a bond issued by the U.S. Treasury with maturity of more than 10 years.

Treasury curve: the yield curve of Treasury securities.

Treasury ETF: a tracking ETF for an index composed of U.S. government debt obligations.

Treasury note (a.k.a. T-note): a debt security issued by the U.S. Treasury with maturity between 1 and 10 years.

tree boosting: a machine learning technique.

trend: the general direction of a market or asset's price, essentially, momentum.

trend following: a trading strategy that aims to capture gains from an asset's momentum in a particular direction.

triangular arbitrage: see *FX triangular arbitrage*.

Twitter sentiment: the sentiment on stocks or other securities extracted from tweets.

U.S. regions: East, Mid-West, South and West.

unadjusted quantity: price or volume unadjusted for splits or dividends.

uncompounded rate: an interest rate applied to the principal during some period without any compounding.

underlying: underlying instrument (e.g., stock in a single-stock option).

underreaction: in financial markets, an insufficient response to news, as some market participants tend to be conservative and rely too much on their prior beliefs.

unexpected earnings: see *standardized unexpected earnings*.

value: a factor based on the book-to-price (B/P) ratio.

value strategy: buying high value (high B/P ratio) stocks and selling low value (low B/P ratio) stocks.

variable coupon bond: see *floating coupon bond*.

variable rate: see *floating interest rate*.

variance: a mean value of the squares of the deviations of the values of a quantity from their mean value.

variance swap: a derivative contract whose payoff at maturity is a product of a preset coefficient (variance notional) times the difference between the realized variance at maturity of the underlying and the preset variance strike.

Vega: the first derivative of the value of a derivative asset (e.g., option) w.r.t. the implied volatility of the underlying asset.

vertical spread: an option strategy that involves all identical put or all identical call options with the exception of their strike prices.

volatility: a statistical measure of the dispersion of returns for a security or market index, which is expressed via the standard deviation or variance of said returns.

VIX: CBOE Volatility Index, a.k.a. the “uncertainty index” or the “fear gauge index”.

volatility carry strategy: a trading strategy consisting of shorting VXX and offsetting the short position with long VXZ (see *volatility ETN*), generally with a non-unit hedge ratio.

volatility ETN: an ETN that tracks VIX, e.g., VXX or VXZ.

volatility index: an index (e.g., VIX) that measures the market's expectation of future (30-day for VIX) volatility based on implied volatilities of the underlying instruments (the S&P 500 stocks for VIX).

volatility risk premium: an empirical occurrence that implied volatility tends to be higher than realized volatility most of the time.

volatility skew: an empirical occurrence whereby, with all else being equal, the implied volatility for put options is higher than for call options.

volatility strategy: a trading strategy that aims to capitalize on an expected high volatility environment, e.g., by buying volatility.

volatility targeting strategy: a trading strategy that aims to maintain a constant volatility level (volatility target, or target volatility) by rebalancing between a risky asset and a risk-free asset.

volume: the number of shares or contracts traded in a security during some period.

watt: a unit of power in the International System of Units (SI).

weather derivative: a derivative (e.g., option or futures) on a synthetic weather index.

weather index: a synthetic index usually based on temperature, using, e.g., cooling-degree-days (CDD) and heating-degree-days (HDD).

weather risk: a risk stemming from businesses and sectors of the economy being affected by weather conditions.

weighted average: for N values x_i ($i = 1, \dots, N$), the weighted mean given by $\frac{1}{N} \sum_{i=1}^N w_i x_i$, where w_i are the weights.

weighted regression: a linear regression with nonuniform regression weights.

weighting scheme: assigning portfolio weights according to some rule, e.g., by suppressing contributions of volatile stocks.

weights (in ANN): in an artificial neural network, the coefficients of the inputs in the argument of an activation function.

weights (in portfolios): see *portfolio weights*.

Whittaker-Henderson method: see *Hodrick-Prescott filter*.

wing: one of the 2 peripheral (by maturity in bond portfolios, and by strike price in option portfolios) legs of a butterfly portfolio.

winnners: stocks or other assets in a portfolio or trading universe that outperform based on some criterion (benchmark).

word (a.k.a. keyword): a keyword in a learning vocabulary.

year-on-year (YoY) inflation: annual inflation (cf. *cumulative inflation*).

year-on-year inflation swap: an inflation swap that references annual inflation (cf. *zero-coupon swap*).

yield: see *bond yield*.

yield curve (a.k.a. term structure): the dependence of interest rates or bond yields on maturities.

yield curve spread: the spread between shorter and longer maturity bonds on the yield curve.

yield curve spread strategy: a bond strategy that makes a bet on the yield curve spread (flattener or steepener).

zero-cost strategy: a dollar-neutral strategy.

zero-coupon bond: see *discount bond*.

zero-coupon inflation swap: an inflation swap that has only one cash flow at maturity and references the cumulative inflation over the life of the swap (cf. *year-on-year inflation swap*).

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Explanatory Comments for Index

In the index entries, plural in many (but not all) cases is reduced to singular (so, e.g., “commodity” also includes “commodities”). Parentheses contain acronyms or definitions, and in some (but not all) cases both versions are present in the main text. Most (but not all) index entries with commas, i.e., “*noun, adjective*”, correspond to text entries such that the precise string “*adjective noun*” is not directly present in the text, but is present indirectly (e.g., as “*adjective (... noun)*”) or contextually.

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