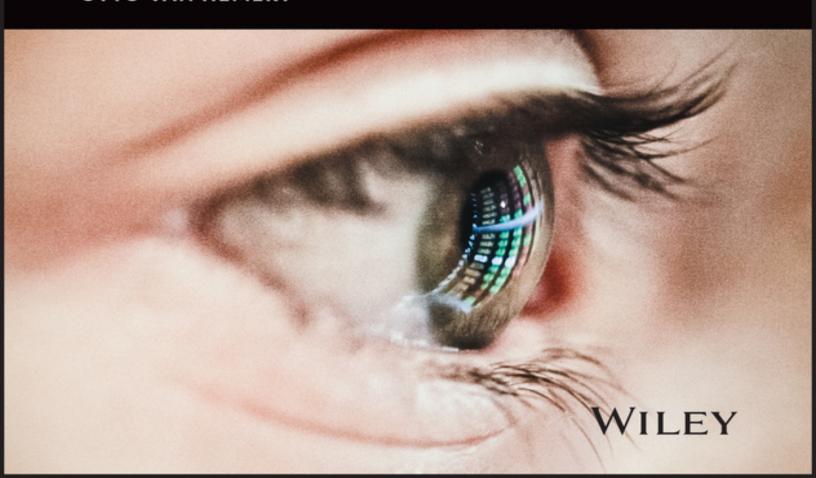
# STRATEGIC RISK MANAGEMENT

Designing Portfolios and Managing Risk

CAMPBELL R. HARVEY SANDY RATTRAY OTTO VAN HEMERT



#### **Table of Contents**

Cover
<u>Title Page</u>
<u>Copyright</u>
<u>Dedication</u>
<u>Foreword</u>
<u>Preface</u>
<u>Acknowledgments</u>
CHAPTER 1: Seeking Crisis Alpha
INTRODUCTION
<u>DATA</u>
<u>STRATEGY</u>
<u>PERFORMANCE</u>
<u>SKEWNESS</u>
CRISIS ALPHA
CONCLUDING REMARKS
<b>APPENDIX 1A: SENSITIVITY ANALYSES FOR</b>
EQUITY AND BOND CRISIS ALPHA AND SMILES
<u>REFERENCES</u>
<u>NOTES</u>
CHAPTER 2: Can Portfolios Be Crisis Proofed?
INTRODUCTION
CRISIS PERFORMANCE OF PASSIVE INVESTMENTS
ACTIVE HEDGING STRATEGIES: TIME-SERIES MOMENTUM

<b>ACTIVE HEDGING STRATEGIES: QUALITY</b>
<u>STOCKS</u>
CAN PORTFOLIOS BE CRISIS PROOFED?
CONCLUDING REMARKS
APPENDIX 2A: LONG PUTS USING OTC PUT
OPTION DATA FROM A BROKER
APPENDIX 2B: LONGER VIEW OF GOLD
APPENDIX 2C: ADDITIONAL RESULTS FOR
<u>QUALITY STOCKS</u>
REFERENCES
<u>NOTES</u>
CHAPTER 3: Risk Management via Volatility Targeting
INTRODUCTION
OUR APPROACH
<u>U.S. EQUITIES</u>
<u>U.S. BONDS AND CREDIT</u>
<u>FUTURES AND FORWARDS</u>
<u>PORTFOLIOS</u>
<b>VOLATILITY SCALING AND THE SHARPE RATIO</b>
OF RISK ASSETS
CONCLUDING REMARKS
APPENDIX 3A: OTHER RISK METRICS
APPENDIX 3B: AUTOCORRELATION OF
<u>VARIANCE</u>
REFERENCES
<u>NOTES</u>
CHAPTER 4: Strategic Rebalancing
INTRODUCTION
COMPARING REBALANCED AND BUY-AND-HOLD
<u>PORTFOLIO RETURNS</u>

IMPACT OF A SIMPLE TREND STRATEGY
<u>ALLOCATION</u>
STRATEGIC REBALANCING
STRATEGIC REBALANCING VERSUS A DIRECT
ALLOCATION TO TREND
CONCLUDING REMARKS
APPENDIX 4A: CERTAINTY EQUIVALENT
PERFORMANCE GAIN
APPENDIX 4B: ADDING TREND TO A 100
PERCENT REBALANCED PORTFOLIO
APPENDIX 4C: THE 30-70 PORTFOLIO
<u>REFERENCES</u>
<u>NOTES</u>
CHAPTER 5: Drawdown Control
<u>INTRODUCTION</u>
<u>DRAWDOWN GREEKS</u>
MANAGER REPLACEMENT RULES
DRAWDOWN-BASED RISK REDUCTION RULES
CONCLUDING REMARKS
APPENDIX 5A: HETEROSKEDASTICITY FOR U.S.
<u>STOCKS</u>
<u>REFERENCES</u>
<u>NOTES</u>
CHAPTER 6: Man versus Machine
<u>INTRODUCTION</u>
<b>CLASSIFICATION OF HEDGE FUNDS</b>
RISK FACTORS
EMPIRICAL ANALYSIS: MACRO FUNDS
EMPIRICAL ANALYSIS: FOUITY FUNDS

<b>DIVERSIFICATION POTENTIAL OF DIFFERENT</b>	
HEDGE FUND STYLES	

**CONCLUDING REMARKS** 

APPENDIX 6A: FUND CLASSIFICATION METHOD

APPENDIX 6B: THE RECENT RISE OF LIQUID

**ALTERNATIVE CTA MUTUAL FUNDS** 

**REFERENCES** 

**NOTES** 

<u>CHAPTER 7: Out-of-Sample Evidence from the COVID-19 Equity Selloff</u>

**INTRODUCTION** 

THE BEST STRATEGIES DURING THE COVID-19

**EQUITY SELLOFF** 

**VOLATILITY TARGETING** 

**STRATEGIC REBALANCING** 

**CONCLUDING REMARKS** 

**NOTES** 

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**SANDY RATTRAY** 

OTTO VAN HEMERT

<u>Index</u>

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#### **List of Tables**

Chapter 1

TABLE 1.1 **Data.** This table provides the start date for the securities used in thi...

- TABLE 1.2 **Sharpe ratio for different momentum strategies.** This table reports the ...
- TABLE 1.3 **Skewness for different momentum strategies.** The annualized skewness of ...

#### Chapter 2

- TABLE 2.1 **Performance over drawdown periods.** We report the total return of the S...
- TABLE 2.2 **Performance over recession periods.**The annualized standard deviation o...
- TABLE 2.3 **Data for futures time-series momentum analysis.** This table lists the 50...
- TABLE 2.4 Average return three-month futures times-series momentum for equity qui...
- TABLE 2.5 Equity factor performance over drawdown and recession periods. We repor...
- TABLE 2.6 Quality factor definitions. We list the various quality factors use...
- TABLE 2.7 Quality factor performance, betaneutral. We report the total return of...
- TABLE 2.8 Average return beta-neutral quality composites for equity quintiles. We...
- TABLE 2.9 Correlation between strategies considered in this chapter. We report th...
- TABLE 2.10 **Effectiveness of dynamic hedges.** We simulated portfolios with varying ...
- TABLE 2A.1 **Long puts.** We report the total return of the S&P 500 and various long ...
- TABLE 2C.1 Quality factor performance, dollar-neutral. We report the total return...

### TABLE 2C.2 Quality composites four-factor regression analysis. We report the outp...

#### Chapter 3

- TABLE 3.1 **Securities and sample periods.**In all cases, the frequency of the data u...
- TABLE 3.2 **Performance statistics.** As a default, we compute the Sharpe ratio, vola...
- TABLE 3.3 Performance statistics Equities All U.S. (1927-2017). The table r...
- TABLE 3.4 Performance statistics S&P 500 futures (1988-2017) using intraday vol e...
- TABLE 3.5 **Performance statistics U.S. bonds** (1963-2017). The table reports ...
- TABLE 3.6 Performance statistics 10-year Treasury futures (1988-2017), also using...
- TABLE 3.7 **Performance statistics for U.S. Credit (1988-2017).** The table rep...
- TABLE 3.8 Performance statistics for the balanced portfolio (1988-2017). Th...
- TABLE 3.9 Performance statistics for the risk parity portfolio (1988-2017).

#### Chapter 4

- TABLE 4.1 *Rebal* plus trend performance statistics. We contrast a 100 percent allo...
- TABLE 4.2 Rebalancing with frequency and threshold rules. We show results for fre...
- TABLE 4.3 **Strategic rebalancing with stock-bond trend rules.** This shows the resul...

TABLE 4A.1 Alternative performance metrics (stocks and bonds trend, equal risk). ...

TABLE 4B.1 Performance for fully invested rebalanced portfolio with stocks ...

TABLE 4C.1 Rebal plus stocks&bonds trend performance statistics for the 30-70 por...

TABLE 4C.2 Strategic rebalancing with stockbond trend rules for the 30-70 portfo...

#### Chapter 5

TABLE 5.1 Cutoff values associated with a given probability of replacement after ...

TABLE 5B.1 **Historical biggest negative (gap) moves.** The table shows for a number ...

#### Chapter 6

TABLE 6.1 **Performance of different hedge fund styles.** Reported statistics are for...

TABLE 6A.1 **HFR category names, fund count, systematic words used.** We present for ...

TABLE 6B.1 Return attribution for macro funds when including the SG Trend Indicat...

#### Chapter 7

TABLE 7.1 **Performance over drawdown periods.** We report the total return of the S...

TABLE 7.2 Moving-average crossover (mac) versus momentum (mom) correlations. We r...

TABLE 7.3 **Performance of moving-average crossover** (*mac*) **versus momentum** (*mom*). We...

### TABLE 7.4 Strategic rebalancing in the first quarter of 2020. In Panel A, we repo...

#### List of Illustrations

#### Chapter 1

FIGURE 1.1 Cumulative excess returns and drawdowns in the stock and bond mar...

FIGURE 1.2 **Performance of single-month momentum strategies.** The bars show th...

FIGURE 1.3 Single-month momentum
performance and weights BTOP50 replication

. . .

FIGURE 1.4 Cumulative performance for different momentum strategies. All str...

FIGURE 1.5 **Delta of straddle versus momentum response function.** Figure 1.5 s...

FIGURE 1.6 momCTA performance, equity and bond quintiles, rolling three-mont...

FIGURE 1.7 momCTA performance, equity and bond quintiles, rolling three-mont...

FIGURE 1.8 momCTA performance, equity and bond quintiles, rolling three-mont...

FIGURE 1A.1 momCTA performance, equity and bond quintiles, rolling 12-month ...

FIGURE 1A.2 momCTA performance, equity and bond quintiles, rolling three-mon...

FIGURE 1A.3 mom(1,4), mom(5,8), mom(9,11) performance, equity and bond quint...

Chapter 2

FIGURE 2.1 Passive investment total returns over time. We show the cumulativ...

FIGURE 2.2 **Time varying co-movement between equity and bond returns.** In Pane...

FIGURE 2B.1 **Time varying co-movement between equity and gold returns (funded...** 

#### Chapter 3

FIGURE 3.1 Equities All U.S. returns (1926-2017). The first three pane...

FIGURE 3.2 Quintile analysis for Equities All U.S. (1926-2017). The le...

FIGURE 3.3 Cumulative returns, realized volatility, left and right tail for ...

FIGURE 3.4 Performance statistics for Equities All U.S. (1927-2017). T...

FIGURE 3.5 **U.S. bond returns (1926-2017).** The top three panels of the ...

FIGURE 3.6 Quintile analysis for U.S. bonds (1962-2017). The left pane...

FIGURE 3.7 Cumulative returns, realized volatility, left and right tail for ...

FIGURE 3.8 Cumulative returns, realized volatility, left and right tail for ...

FIGURE 3.9 Autocorrelation of futures and forwards variance (1988-2017)....

FIGURE 3.10 Performance statistics for futures and forwards (1988-2017)....

FIGURE 3.11 Cumulative returns, realized volatility, left and right tail ret...

FIGURE 3.12 Cumulative returns, realized volatility, left and right tail for...

FIGURE 3.13 Leverage effect for various assets. This figure shows the contem...

FIGURE 3.14 Correlation past returns and 1/vol for various assets. This figu...

FIGURE 3.15 Improvement Sharpe Ratios when volatility scaling versus correla...

FIGURE 3A.1 Skewness and kurtosis for Equities All U.S. (1926-2017). T...

FIGURE 3A.2 Skewness and kurtosis for futures and forwards (1988-2017)....

FIGURE 3A.3 Drawdown plot for Equities All U.S., Balanced portfolio, and Ris...

FIGURE 3B.1 Persistence of monthly variance for Equities All U.S. (1926-2017...

FIGURE 3B.2 Persistence of monthly U.S. equity and bond variance (1962-2017)...

#### Chapter 4

FIGURE 4.1 Allocation to stocks for a monthly-rebalanced and buy-and-hold po...

FIGURE 4.2 **Performance of monthly- rebalanced and buy-and-hold portfolio (200...** 

FIGURE 4.3 *Rebal*-minus-*Hold* versus stock-minus-bond one-year returns. The fi...

FIGURE 4.4 Three-month trend versus stock-minus-bond one-year return. One-ye...

FIGURE 4.5 **Drawdown level of a monthly** rebalanced 60-40 portfolio. The...

FIGURE 4.6 Allocation to stocks and bonds for the various portfolios conside...

FIGURE 4.7 Stock allocation for different rebalancing rules. In this figure,...

FIGURE 4.8 Impact of adding a trend exposure versus the stock-minus-bond one...

FIGURE 4.9 Impact of adding a trend exposure on the portfolio drawdown level...

#### Chapter 5

FIGURE 5.1 Probability distribution for the maximum drawdown statistic. The ...

FIGURE 5.2 Sensitivity of the probability of a maximum drawdown to key param...

FIGURE 5.3 **Drawdown probability with bootstrapped U.S. equity returns.** The f...

FIGURE 5.4 Impact of gap risk. The figure shows probability of reaching a ma...

FIGURE 5.5 Illustrative manager performance. Illustrative example of a manag...

FIGURE 5.6 Efficacy classification rules with a **10-year horizon.** We show the...

FIGURE 5.7 Efficacy of replacement rules with monthly evaluation. We show th...

FIGURE 5.8 Efficacy of the drawdown replacement rules with monthly evaluatio...

FIGURE 5.9 Equivalent thresholds through time for the different drawdown rep...

FIGURE 5.10 Efficacy of risk reduction rule, monthly evaluation, no type mig...

### FIGURE 5A.1 Monthly U.S. equity returns and rolling 12-month volatility. In ...

#### Chapter 6

FIGURE 6.2 Regression analysis for macro funds. We run regressions of system...

FIGURE 6.3 Regression analysis for equity funds. We run regressions of syste...

FIGURE 6B.1 AUM for the constituents of the SG CTA Mutual Fund Index (2010-2...

#### Chapter 7

FIGURE 7.1 Passive investment total return over time. We show the cumulative...

FIGURE 7.2 Performance SG CTA indices over the 2020 equity drawdown period. ...

FIGURE 7.3 Moving-average crossover (mac) versus momentum (mom) weight to la...

FIGURE 7.4 Volatility scaling of equity returns during the first quarter of ...

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### Strategic Risk Management

## **Designing Portfolios and Managing Risk**

**CAMPBELL R. HARVEY** 

**SANDY RATTRAY** 

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#### **Foreword**

#### By Martin Leibowitz

Active funds devote considerable effort to the search for excess returns, but risk considerations often fail to get anywhere near the same level of attention. The authors of this book, Campbell Harvey, Sandy Rattray, and Otto Van Hemert, take risk seriously and give it the consideration it deserves.

Risk considerations can get short shrift in many ways. For example, historical returns typically are reported without reference to the risk taken to achieve them. Unfortunately, without a better understanding of the risk involved, it is difficult to estimate the likelihood that such (possibly fortuitous) returns can be repeated.

In the standard risk management approach, the focus is on setting volatility constraints associated with various targets and benchmarks. Such constraints often are based on the probability of a significant downdraft that could adversely impact the current investment strategy. In actuality, the commonality of such constraints across a wide range of funds suggests that some peer group pressure might also be at play.

Once risk limits have been established, managers generally are permitted to roam relatively freely in the search for higher returns. Risk considerations are then relegated to ensuring that returns stay within the pre-established bounds. In effect, this approach tends to put risk assessment in a box that is removed from day-to-day fund management.

In the asset allocation context, this fence-posting behavior is built on the belief that the maximum expected return is

equivalent to the optimal return. However, that may not be the case when the fund's "true" objectives are considered.

This book's authors make the case that the position of a fund relative to its risk boundaries should be integrated into any consideration of investment shifts. The challenge is garnering sufficient incremental return from new investments to justify all incremental risks.

In theory, each incremental investment initiative or allocation shift should be based on a holistic risk/return valuation. This valuation should include an understanding of the interaction between marginal investment changes and the probability of success relative to various absolute and/or market-sensitive performance goals. An absolute goal might be to achieve a specific return or some given level of spending. Market-sensitive goals might include a desired probability that the fund's performance will exceed that of a peer group, market benchmark, or customized reference portfolio.

When such market-sensitive targets are considered, correlations between investment and target returns become important. The incremental return advantage versus a moving target will be improved if the portfolio and the target are closely aligned along the primary dimension of risk.

Significant risk events are likely to spawn a need for portfolio rebalancing. Most funds do rebalance at both prescribed time intervals and following sufficiently sizeable market moves. However, the rebalancing process can easily devolve into a mechanical regimen that simply moves the fund back to its preordained policy portfolio.

This auto-rebalancing protocol is based on the presumption that significant market events do not seriously impact going-forward prospects. This presumption is based on the belief that, over time, the market presents the same face to investors—both before and after major market moves. This equilibrium-mandated framework is comforting because it relieves fund managers of the need to peer into the clouded world of uncertainty and tease out revised policy portfolios. While it is true that a return to a prior equilibrium often occurs, it is also true that significant risk events can change the market's going-forward return characteristics as well as the fundamental risk tolerance of the fund itself!

In this book, Harvey, Rattray, and Van Hemert take a broader view of the rebalancing problem. They make the case that, rather than being based on a fixed periodic timetable, rebalancing should be more closely attuned to market conditions. For example, discernible changes in a market's prospective risk should play an important role in shaping the rebalancing process. It serves little purpose to speedily rebalance against a strongly trending market.

Harvey, Rattray, and Van Hemert provide concrete illustrations and techniques for more fully integrating risk considerations into both the rebalancing process and the day-to-day management of the fund. For example, they show how volatility scaling provides a risk management function by reducing allocations when risks are increasing. They also study a range of investment strategies and assess how each strategy performed historically in times of crisis.

Although the research in this book was conducted prior to the COVID-19 outbreak, a postscript has been added to show how their approach fared during the first two quarters of 2020. It appears that both volatility scaling and strategic rebalancing did serve to improve portfolio performance.

The authors' focus on these asset management issues is grounded in their fund management experience, their deep understanding of the latest financial theory, and their own published work. (In this regard, it should be noted that Professor Harvey was recently named the "2020 Quant of the Year" by the *Journal of Portfolio Management* for outstanding academic contributions to the field of quantitative finance.)

In this book, the authors—each with their exceptional credentials in this area—have been most generous in sharing their hard-won insights with the investment field at large.

President, Advanced Portfolio Studies LLC, and Senior Advisor to Morgan Stanley

#### **Preface**

#### **By Sandy Rattray**

One of our core beliefs at Man Group is that risk management of portfolios is just as important as alpha generation. Based on a number of articles we've published over the past five years, this book is derived from some of the key areas of risk management where we have had something to add and the practical experience we have as fund managers. The motivation for writing this book often came from questions asked by our clients that we thought would be interesting to others, and sometimes from specific problems that we were thinking about ourselves.

In Seeking Crisis Alpha (Chapter 1), we write about a theme that is close to our hearts: the ability of time series momentum to produce strong returns in weak market environments. We challenge the consensus view that this feature is limited to generating alpha in weak equity markets by finding very similar results in bond markets. We also show that time series momentum has some similar features to a long (put and call) options strategy. Aside from our momentum funds, we have directly used the protective feature of momentum in our long-only multiasset programs. The chapter was written to respond to the many comments we received: that futures momentum could only protect against equity market drawdowns. Even with a 25-year history for our flagship trend fund, we needed to generate additional historical returns going back to the 1960s to test for protection against bond market selloffs.

We develop this theme further in *Can Portfolios Be Crisis Proofed?* (Chapter 2) by exploring a range of crisis alpha strategies. These include: long S&P 500 put options, long U.S. Treasury bonds, long gold and long protection on

credit spreads, as well as futures momentum and long high-quality, short low-quality equities. We argued that put options are the most reliable, but most expensive, strategy, and that U.S. Treasury bonds have historically been unreliable. Credit protection and long gold fit somewhere between options and Treasuries, on both reliability and cost. Time series momentum and quality combine the attractive features of positive returns in both good and bad periods (at some reliability cost). We have, over the years, built solutions for clients utilizing equity options, credit protection, times series momentum, and equity quality to fit specific investor preferences. Our motivation was to try to create a single framework for these strategies.

Risk Management via Volatility Targeting (Chapter 3) takes a different approach to risk management by focusing on methods to keep asset and portfolio volatility stable over time. This is in contrast to most investment strategies, which try to keep exposure stable over time. Many systematic hedge fund strategies use some form of volatility targeting, while risk parity is one of the few longonly approaches to use this technique. We show that scaling positions by an expected volatility (using recent historical returns) produces more stable risk outcomes in all the asset classes that we study (i.e., reduced tail losses and more stable experienced volatility). In equities and credit, volatility scaling somewhat increases historical Sharpe ratios, perhaps because these assets show a leverage effect themselves (becoming naturally more volatile with lower prices). Volatility targeting has been a mainstay of our Man AHL hedge fund and long-only strategies for many years, and we continue to believe that it has helped us limit portfolio drawdowns historically.

In *Strategic Rebalancing* (Chapter 4), we summarize several years' worth of research on the impact of rebalancing on portfolio returns. For us, rebalancing is core

to almost all portfolio management, and yet its risk characteristics are weefully underexplored. Rebalancing has many benign features, including the obvious risk balancing and less obvious return improvement. However, we show that rebalanced portfolios generally underperform buy-and-hold portfolios in extreme market environments where assets show strong momentum (because the rebalancing keeps buying the underperforming asset and selling the outperforming asset). It is possible to rebalance better by taking account of this momentum effect (i.e., delay rebalancing when momentum is against you). This has maintained the advantages of rebalanced portfolios by retaining the asset class balance, but reduces the underperformance that rebalancing introduces in stress periods. The chapter was prompted by a client remarking that rebalancing is a "short volatility" strategy, which caused us to start exploring the topic in much more depth and realizing the importance of active choices in rebalancing strategy.

In *Drawdown Control* (Chapter 5), we explore the impact of cutting risk when drawdowns occur. This is an approach very commonly used by investors and yet barely mentioned in academic literature. We show that drawdown rules can be effectively used to weed out strategies (or managers) who lose the ability to generate alpha, and that this improves portfolio risk-and-return characteristics.

All of the tools we advocate are quantitative. In *Man vs. Machine* (Chapter 6), we look at both the risk and performance of systematic versus discretionary hedge fund strategies. This started as a performance comparison project in response to a client query. It ended up focusing on risk-adjusted returns. We found that discretionary and systematic macro managers are united in their long exposure to volatility, which can help in crises. For equity funds, discretionary managers have shown higher

performance than systematic ones, but this difference is entirely explained by discretionary managers having larger factor exposures, especially to the market and size factors.

How have our suggestions held up in 2020? Well, at the time of writing, it's too early to tell. But in *Out-of-Sample Evidence from the COVID-19 Equity Selloff* (Chapter 7), we take a look. The results show that these risk management techniques remained effective and we continue to rely on them in our own fund management strategies. We have added this analysis as a final chapter to the book.

Many of the chapters of this book are based on work that was published in the *Journal of Portfolio Management* with a number of our colleagues at Man Group. We are grateful for their support over the past few years and their comments on our manuscript.

The book provides, we hope, a practical insight into how to manage risk well. There has been no better test than the recent market events of the first half of 2020. While we are clearly not out of this period of turbulence, we believe that our approach to strategic risk management provides some guidance on how to better manage risk through difficult periods. That's half the challenge of being a portfolio manager, and often the more-overlooked half.

#### **Acknowledgments**

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The authors would like to thank their colleague, Darshini Shah, for her great help in this production of the book, her unceasing good humour and her encouragement in bringing this to the finish line.

### CHAPTER 1 Seeking Crisis Alpha

#### INTRODUCTION

The idea of risk management is to provide some protection during adverse events. However, the cost of that protection must be balanced against the benefit. For example, in a strategy that uses costly long put options to eliminate the downside, the portfolio's return should not be greater than the risk-free rate. By contrast, we focus on the idea of crisis alpha, which uses dynamic methods that lower risk and also preserve excess returns. In this sense, they provide alpha when it is most needed—during crisis periods. \( \frac{1}{2} \)

Trend following is one technique that works especially well with a crisis-alpha strategy. Theoretically, trend-following strategies sell in market drawdowns (mimicking a dynamic replication of a long put option) and buy in rising markets (mimicking a dynamic replication of a long call option). This resembles a long straddle position and induces positive convexity. While it is possible to purchase the long straddle directly, that is expensive. Implementing a trend-following strategy is not expensive, but it is not as reliable as taking option-based insurance.

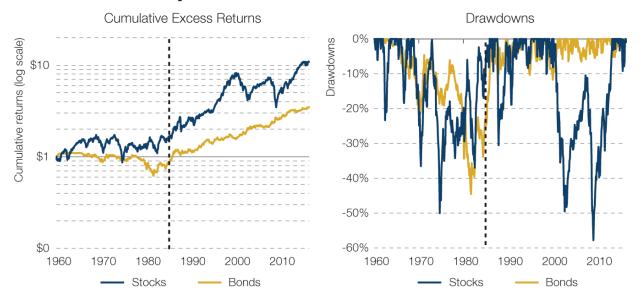
Much of our book focuses on these costs and benefits. We assess the after-cost performance of different strategies (including option-based strategies) in various risk-on events.

Our starting point is a deep dive into time-series momentum (trend-following) strategies in bonds, commodities, currencies, and equity indices between 1960 and 2015. Over the last few years, institutional investors have turned to futures trend-following strategies to provide "crisis alpha." Our analysis shows that these momentum strategies performed consistently both before and after 1985, periods which were marked by strong bear and bull markets in bonds, respectively.

We document a number of important risk properties. First, returns are positively skewed, which is consistent with the theoretical link between momentum strategies and a long option straddle strategy. Second, performance was particularly strong in the worst equity and bond market environments, giving credence to the claim that trend following can provide equity and bond crisis alpha. Putting restrictions on the strategy to prevent it being long equities or long bonds has the potential to further enhance the crisis alpha, but reduces the average return. Finally, we examine how performance has varied across momentum strategies based on returns with different lags and applied to different asset classes.

#### **Backdrop**

Government bonds have experienced an extended bull market since 1985. This is illustrated in the left panel of <u>Figure 1.1</u>, where we plot the cumulative excess return of U.S. 10-year Treasuries and the S&P 500 index, relative to the U.S. T-bill rate. This shows a steady increase in cumulative bond returns since 1985. The right panel of <u>Figure 1.1</u> plots the drawdown level, which rarely exceeded 10 percent for bonds in the post-1985 period. A trend-following strategy holding a (predominantly) long bonds position would have benefited from the consistent upward direction after 1985.



**FIGURE 1.1** Cumulative excess returns and drawdowns in the stock and bond markets (1960-2015). The left panel shows the cumulative return of stocks (S&P 500 index) and bonds (U.S. 10-year Treasury), in excess of the U.S. T-Bill rate. The right panel shows the drawdown relative to the highest cumulative return achieved to date for both stocks and bonds. The data period is January 1960 to December 2015 and the dashed, vertical line separates the pre- and post-1985 period.

The strong bond performance was driven by significant interest-rate compression. U.S. yields fell from almost 16 percent in the early 1980s, to below 2 percent in March 2016. While in some countries yields have turned slightly negative, most economists believe yields cannot become very negative, and as such we are unlikely to see a similarly large yield compression in future decades. In light of this, it is natural to ask whether, in the absence of a bond market tailwind, trend-following strategies can maintain performance and protect against bond-market stress similar to that seen in the 1960s, 1970s, and early 1980s.

#### **Outline**

In this chapter we seek to shed light on three questions by studying trendfollowing strategies from 1960 onwards:

- 1. Should we expect futures trend following to be profitable in an environment where government bond yields rise?
- 2. Are the protective characteristics of trend following confined to equities, or do they work for government bonds as well?
- 3. Is it possible to improve the protection characteristics of a futures momentum strategy by removing the ability to be long equities?

Importantly, there is a stark difference between the pre-1985 period and the post-1985 period. Between 1960 and 1985, bonds experienced negative excess returns on average while stock markets provided modest positive average excess returns and quite frequent drawdowns (<u>Figure 1.1</u>).

In the first section, we discuss the available data to ground our understanding of the markets between 1960 and 1985. The second section defines a straightforward momentum strategy. Extending our analysis back to 1960 requires us to use monthly data and augment the available history of futures and forward returns with proxies based on cash returns, financed at the local short-term rate.

In the next section, we show that strategies based on the past four months' returns (lag 1 to 4) experience consistently strong performance, as do strategies based on returns of almost a full year ago (lags 9 to 11). However, strategies based on returns at the intermediate horizon (lags 5 to 8) underperform consistently over time and across asset classes. Next, we form a momentum strategy that places weights on historical lagged returns, such that it best matches the representative BTOP50 managed futures index (we label our strategy *momCTA*) and find that this replicating strategy allocates almost all weight on lags 1 to 4, thus largely ignoring the predictability of lags 9 to 11.

In the two sections that follow, we show that *momCTA* inherits two important risk characteristics that are particularly associated with momentum strategies based on recent returns. In the section about skewness, we show that *momCTA* has positively skewed returns, in particular when returns are evaluated over multiple months. (We specifically consider 3- and 12-month evaluation windows.) We argue this result is intuitive and related to the strategy's property of adding to winners and cutting losers, which is similar to the dynamic replication of a long option straddle position.

Then, in the section on crisis alpha, we show that *momCTA* performed particularly well in the worst equity and bond market environments, giving empirical support to a claim that trend-following can provide crisis alpha for both equities *and* bonds. Performance was strong in not only the worst but also the best equity and bond market environments, revealing a well-known equity market smile and a lesser-known, but even more pronounced bond market smile.

We find that the equity and bond crisis alpha was further enhanced when we restricted the equity and bond position to be non-positive. However, this comes