Crisis Logic

Investing Amidst Uncertainty

Tobias J. MoskowitzPrincipal, AQR Capital Management
Dean Takahashi Chaired Professor of Finance, Yale University

October 18, 2023



Disclosures

The information set forth herein has been obtained or derived from sources believed by AQR Capital Management, LLC ("AQR") to be reliable. However, AQR does not make any representation or warranty, express or implied, as to the information's accuracy or completeness, nor does AQR recommend that the attached information serve as the basis of any investment decision. This document has been provided to you solely for information purposes and does not constitute an offer or solicitation of an offer, or any advice or recommendation, to purchase any securities or other financial instruments, and may not be construed as such. This document is intended exclusively for the use of the person to whom it has been delivered by AQR and it is not to be reproduced or redistributed to any other person. Please refer to the Appendix for more information on risks and fees. Past performance is not a guarantee of future performance.

This presentation is not research and should not be treated as research. This presentation does not represent valuation judgments with respect to any financial instrument, issuer, security or sector that may be described or referenced herein and does not represent a formal or official view of AOR.

The views expressed reflect the current views as of the date hereof and neither the speaker nor AQR undertakes to advise you of any changes in the views expressed herein. It should not be assumed that the speaker or AQR will make investment recommendations in the future that are consistent with the views expressed herein, or use any or all of the techniques or methods of analysis described herein in managing client accounts. AQR and its affiliates may have positions (long or short) or engage in securities transactions that are not consistent with the information and views expressed in this presentation.

The information contained herein is only as current as of the date indicated, and may be superseded by subsequent market events or for other reasons. Charts and graphs provided herein are for illustrative purposes only. The information in this presentation has been developed internally and/or obtained from sources believed to be reliable; however, neither AQR nor the speaker guarantees the accuracy, adequacy or completeness of such information. Nothing contained herein constitutes investment, legal, tax or other advice nor is it to be relied on in making an investment or other decision.

There can be no assurance that an investment strategy will be successful. Historic market trends are not guarantees of actual future market behavior or future performance of any particular investment which may differ materially, and should not be relied upon as such. Target allocations contained herein are subject to change. There is no assurance that the target allocations will be achieved, and actual allocations may be significantly different than that shown here. This presentation should not be viewed as a current or past recommendation or a solicitation of an offer to buy or sell any securities or to adopt any investment strategy.

The information in this presentation may contain projections or other forward-looking statements regarding future events, targets, forecasts or expectations regarding the strategies described herein, and is only current as of the date indicated. There is no assurance that such events or targets will be achieved, and may be significantly different from that shown here. The information in this presentation, including statements concerning financial market trends, is based on current market conditions, which will fluctuate and may be superseded by subsequent market events or for other reasons. Performance of all cited indices is calculated on a total return basis with dividends reinvested.

The investment strategy and themes discussed herein may be unsuitable for investors depending on their specific investment objectives and financial situation. Please note that changes in the rate of exchange of a currency may affect the value, price or income of an investment adversely.

Neither AQR nor the speaker assumes any duty to, nor undertakes to update forward looking statements. No representation or warranty, express or implied, is made or given by or on behalf of AQR, the speaker or any other person as to the accuracy and completeness or fairness of the information contained in this presentation, and no responsibility or liability is accepted for any such information. By accepting this presentation in its entirety, the recipient acknowledges its understanding and acceptance of the foregoing statement.



Overview and Current Macroeconomic Environment



Topics

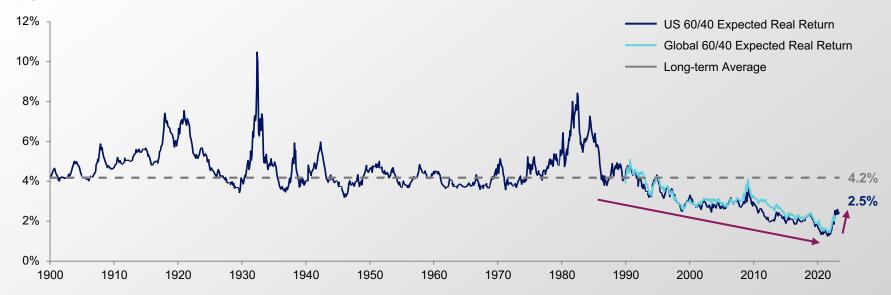
- 1. Current environment
- 2. What could go wrong
- 3. What helps when things turn ugly



Still a world of low expected returns

Simple Expected Real Return of U.S. and Global 60/40 Stock/Bond Portfolios

January 1, 1900 – June 30, 2023



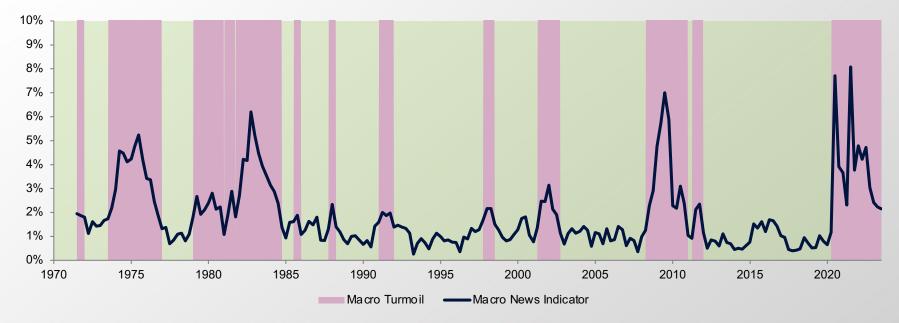


Source: AQR, Bloomberg, Robert Shiller's Data Library, Ibbotson Associates (Morningstar), Kozicki-Tinsley (2006), Federal Reserve Bank of Philadelphia, Blue Chip Economic Indicators, Consensus Economics. Earnings data through 6/30/2023. U.S. 80/40 portfolio is 60% U.S. equities and 40% long-dated Treasuries; Global 60/40 portfolio is 60% MSCI World and 40% GDP-weighted long-dated government bonds from countries in MSCI World universe. Real equity yield is simple average of two measures: (0.5 * Shiller E/P * 1.075) + 1.5%; and Dividend/Price + 1.5%. The 1.5% term is assumed long term real earnings per share (EPS) growth. The 0.5 multiplier reflects the long-term payout ratio; the 1.075 multiplier accounts for EPS growth during 10-year earnings window. U.S. stock universe is S&P 500. Real bond yield is yield on long-term government bonds minus long-term expected inflation based on Blue Chip Economic Indicators, Consensus Economics and the Federal Reserve Bank of Philadelphia. Before survey data became available in 1978, expected long-term inflation is based on statistical estimates and on 1-year ahead Livingston inflation forecasts. This is one set of estimates of ex-anter early yields for equities and bonds, but other reasonable specifications should tell broadly the same story. Chart is for illustrative purposes only. Past performance is not a guarantee of future performance. Please read important disclosures in the Appendix.

We're in a period of macroeconomic uncertainty

U.S. Growth and Inflation News and a Macro Turmoil Regime Indicator

January 1, 1972 – June 30, 2023



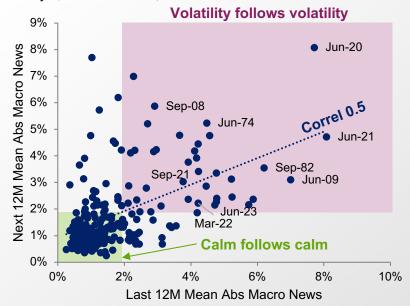


Sources: AQR, U.S. Bureau of Labor Statistics, Federal Reserve, Bloomberg. Macro Turmoil is defined as 12-month period for which macro news magnitude exceeds full sample mean. Based on 12-month returns at quarterly frequency. Macro news magnitude measure is based on changes in RGDP growth, changes in inflation, inflation surprises, RGDP growth surprises and industrial production (IP) growth surprises. Changes are calculated as simple difference between year-on-year inflation or growth and year-on-year inflation or growth and 1-year forecast 12 months earlier from Fed Survey of Professional Forecasters.

Macroeconomic volatility has tended to persist

Macro News Indicator

January 1, 1972 - June 30, 2023



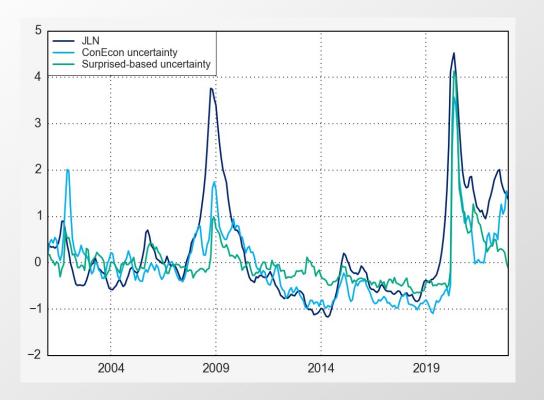
Major Unresolved Macro Questions

- Monetary policy lags: the impact of tight policy has yet to be fully realized
- Central bank tradeoffs: central banks are hiking into an inflation shock for first time in decades
- **Disagreement:** material dispersion between market-implied and policymaker/economist forecasts, as well as across markets



Uncertainty Index

We are in uncertain times

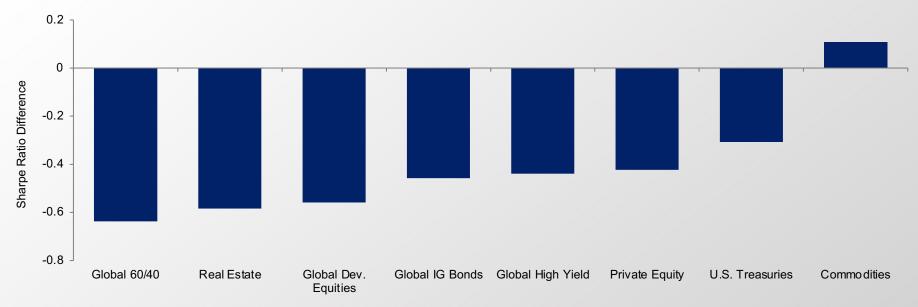




Macro uncertainty is bad news for most traditional assets

Relative Performance of Asset Classes and Hypothetical Strategies During Macro Turmoil

January 1, 1972 – June 30, 2023





Sources: AQR, U.S. Bureau of Labor Statistics, Federal Reserve, Bloomberg. Global 60/40 is 60% Global Dev. Equities and 40% Global IG Bonds. Macro Turmoil is defined as 12-month period for which macro news magnitude exceeds full sample mean. Based on 12-month returns at quarterly frequency. Macro news magnitude measure is based on changes in RGDP growth, changes in inflation, inflation surprises, RGDP growth surprises and industrial production (IP) growth surprises. Changes are calculated as simple difference between year-on-year inflation or growth and year-on-year inflation or growth and 1-year forecast 12 months earlier from Fed Survey of Professional Forecasters. Sharpe ratio is derived from the annualized net return excess of cash, which is the proxy index, over annualized volatility. Asset class proxies and construction of the hypothetical Price and Economic Trend strategies are defined in the Appendix.



Consider three major risks for portfolios

- 1. Recession
- 2. (Continued) inflation
- 3. Geopolitical tensions escalate further
- 4. Who knows what?!!

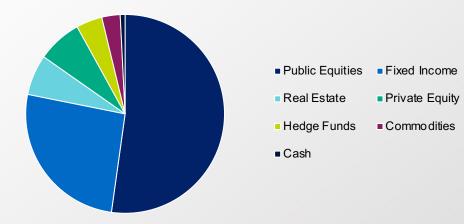


Consider three major risks for portfolios

For each of these scenarios, we use history as a guide to simulate what the effect could be for a typical portfolio:

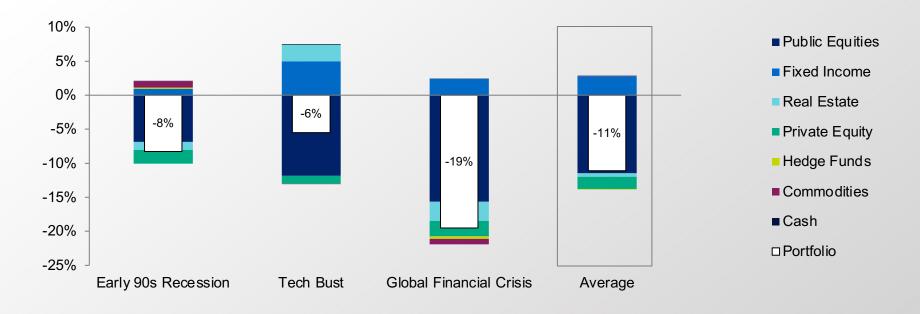
Average Allocation of Typical Portfolio

Fiscal Year 2022



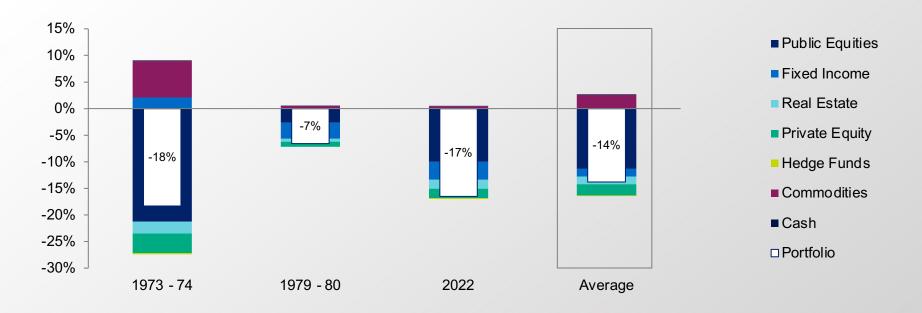


1. Recessionary shock



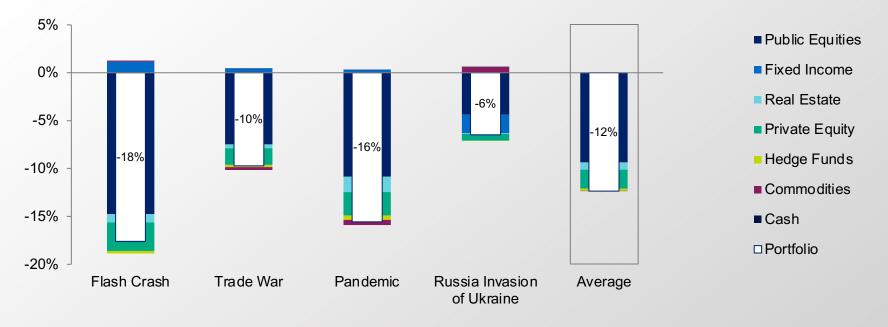


2. Inflationary shock





3. Other Crises





Can crises be predicted?

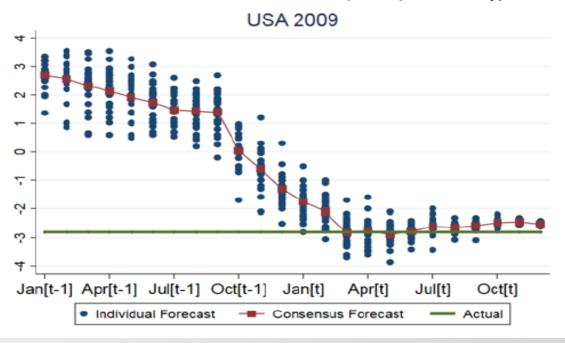
Can the Figure 2. Consensus Forecasts for USA (2009) and Argentina (2001)

No.

At least

Why? B

Forecas





<u>ks</u>.

Overconfidence

A common human bias

1998 NFL Draft: Two "Franchise" QBs





Where Are They Now?





18 of last 23 #1 picks have been QBs

















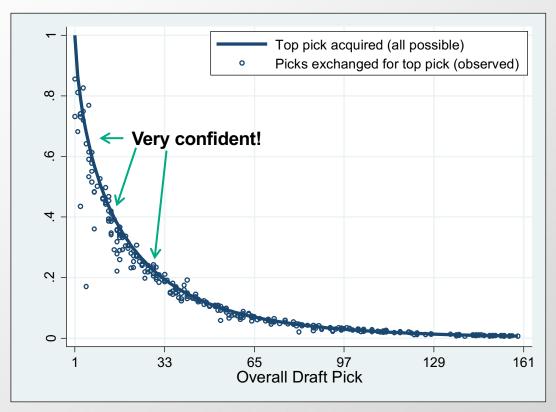






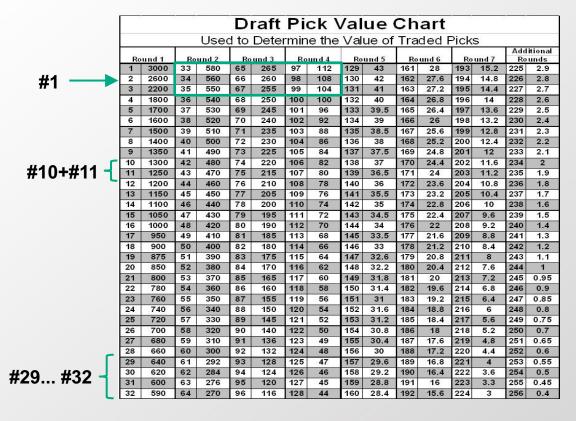


Estimated Trade Value of Draft Picks



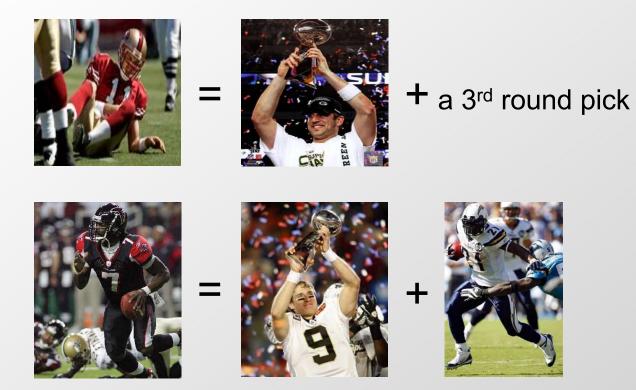


Estimated Trade Value of Draft Picks





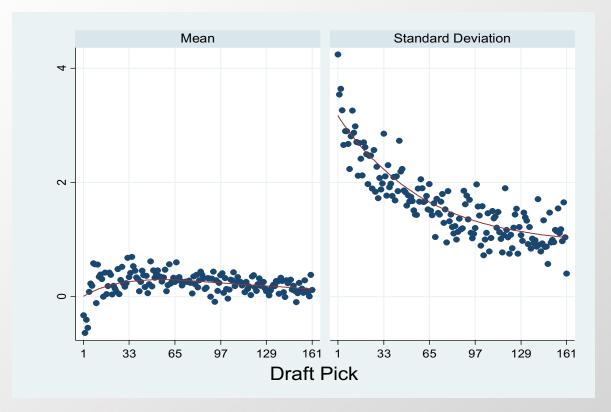
Who Else Could You Have Had?





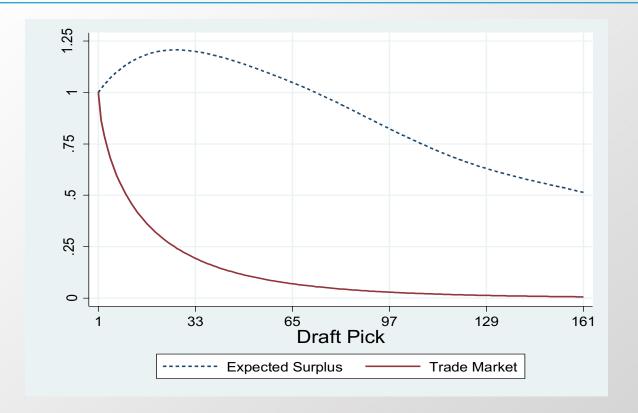
22

High Picks: Low Mean, High Variance





Relative Pick Value





Diversification!

Power of Diversification:

- You can pay a little less,
- You can lower the risk that your pick will be a bust,

and

You have the potential to get better (dollar-adjusted) performance!

It won a Nobel Prize in Economic Sciences for investing!

(Markowitz, 1952, Sharpe, 1964)



What Helps When Things Turn Ugly?



What Helps When Things Turn Ugly?

Seek diversifying strategies

A goal for an alternative portfolio is to diversify your risk – being less exposed to the next crisis, no matter what it is

Some strategies that we think are worth considering:

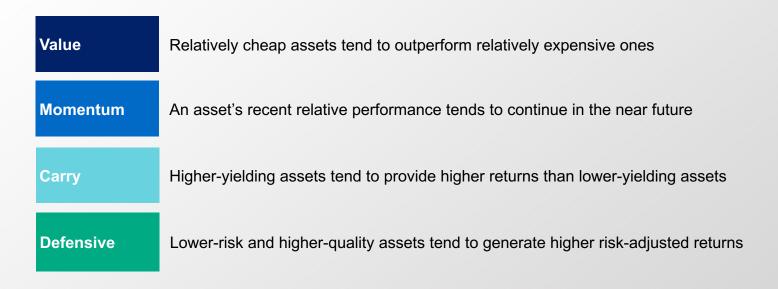
- 1. Liquid alternatives to diversify and reduce tail risk (example: style premia, trend-following)
- 2. Broadly diversify across asset-classes and investment strategies



What Helps (Generally) and When Things Turn Ugly

Example of relative value strategies: Style Premia

Some investment styles have decades of evidence in multiple regions and asset classes:



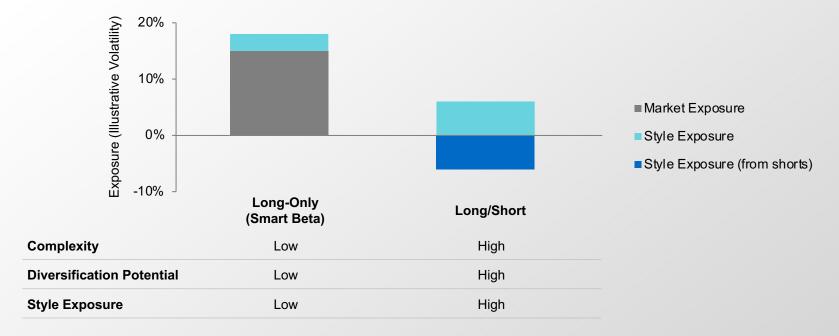


Source: AQR.

28

What Helps When Things Turn Ugly

Going from factor tilts to true diversifiers



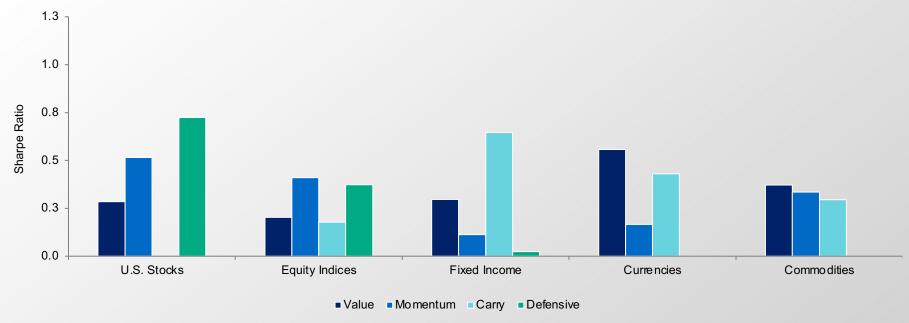


Other Asset Classes

Out of sample evidence (assets and time)

Hypothetical Sharpe Ratios across Factor and Asset Classes (Full Sample)

January 30, 1920 – August 31, 2022





Source: AQR. "Fact, Fiction, and Factor Investing," Aghassi, Asness, Fattouche, Moskowitz (2022). Global Financial Data, Bloomberg, Datastream, Chicago Board of Trade, Commodity Systems Inc. The full sample period starts January 1, 1920 and ends August 31, 2022. Time periods for pre-sample, and original sample can be found in the Appendix. All returns are excess of U.S. treasury bills but gross of trading costs and fees. The risk-free rate is the BofAML U.S. 3 month treasury bill. For illustrative purposes only and not representative of an actual portfolio that AQR currently manages. Hypothetical data has inherent limitations some of which are discussed in the Appendix. Please refer to the Appendix for descriptions of the data sources used and definitions for each style. Please read important disclosures in the Appendix

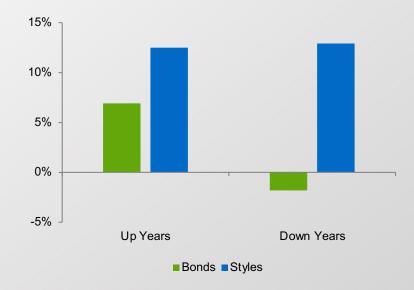
What Helps When Things Turn Ugly

Styles have tended to be resilient to risks in traditional markets

Average Returns when Stock Markets are Positive and Negative January 1, 1990 – December 31, 2022



Average Returns when Bond Markets are Positive and Negative January 1, 1990 – December 31, 2022





Why Do Markets Trend?

Prices tend to under-react to new information

Trends can result from behavioral biases and non-profit-seeking market participants (e.g., hedging, central banks).

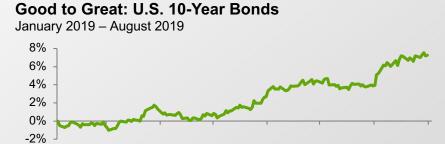




What Helps When Things Turn Ugly

Tends to profit when markets go from "good to great" and "bad to worse"





Apr-19

May-19

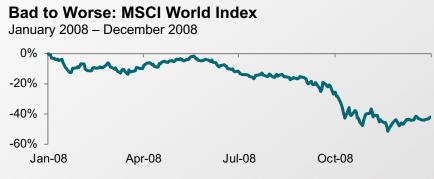
Jun-19

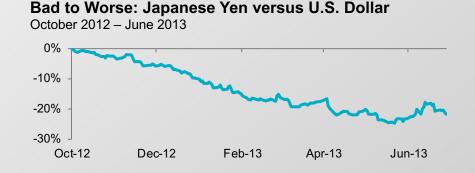
Jul-19

Aug-19

Mar-19

Jan-19 Feb-19







Long-Term Evidence for Trend Following

Trends are pervasive across markets and asset classes

Hypothetical Trend-Following Sharpe Ratio for Individual Assets and Asset Classes

January 1880 – June 2022





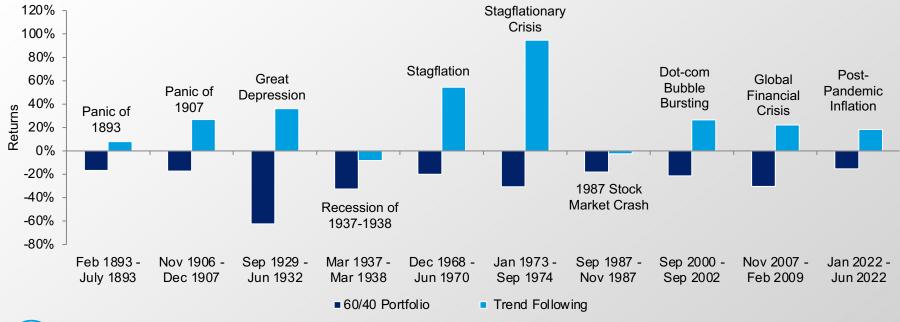
Source: AQR. The Sharpe ratios are based on the Hypothetical Trend-Following Strategy. The results are based on a backtest, net of 2/20 fees and estimated transaction costs. The 3-Month T-Bill is the risk-free rate used to derive the Sharpe ratio. This analysis is provided for illustrative purposes only and is not based on an actual portfolio AQR manages. Not all markets have return data going back to 1880, calculations are based on the longest time period available for each asset. Please read performance disclosures in the Appendix for a description of the investment universe and the allocation methodology used to construct the Trend-Following Strategy. Hypothetical data has inherent limitations, some of which are disclosed in the Appendix.

Why Invest in Trend Following?

Performed well in severe market downturns

Hypothetical Performance During the 10 Largest Drawdowns for a 60/40 Portfolio

January 1880 – June 2022





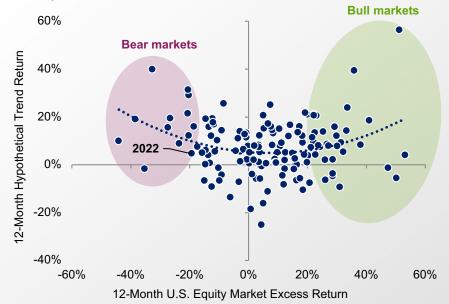
Source: AQR. The Hypothetical Trend-Following Strategy performance is a backtest, net of 2/20 fees and estimated transaction costs. The 60/40 portfolio has 60% invested in S&P 500 and 40% invested in U.S. 10-year bonds. The portfolio is rebalanced monthly, and no fees or transaction costs are subtracted from the returns. Please read performance disclosures in the Appendix for a description of the investment universe and the allocation methodology used to construct the Trend-Following Strategy and for details on the construction of the S&P 500 series. Markets considered only where data existed during the time period. Chart is provided for illustrative purposes only and is not based on an actual portfolio AQR manages. Hypothetical data has inherent limitations, some of which are disclosed in the Appendix.

What Helps When Things Turn Ugly

Directional strategies

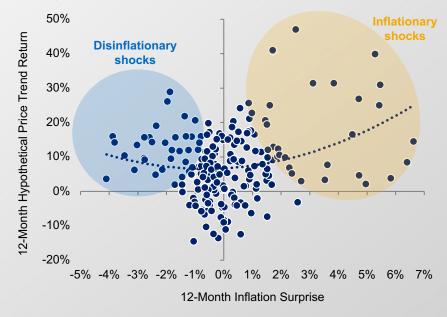
Hypothetical Price Trend vs. Equity Returns

January 1880 – December 2022



Hypothetical Price Trend vs. Inflation Surprises

January 1972 - December 2022





Source: AQR. Hypothetical price trend following strategy as described in A Century of Evidence on Trend Following (Hurst, Ooi and Pedersen, 2017), net of transaction costs and 1.25 & 20 fees – for more details see appendix. Prior to 1926, the U.S. Equity series is constructed by adding price-weighted capital appreciation returns of NYSE stocks collected by Goetzmann, Ibbotson, and Peng to U.S. equity dividend returns erecorded by the Cowles commission. The series consists of returns of the S&P 90 from 1926 to 1957 and returns of the S&P 500 from 1957 onwards. Returns are excess of cash proxied by the carry on 3-Month T-Bills. Inflation surprise is realization minus forecast from Fed Survey of Professional Forecasters. Chart shows 12-month returns and surprises and quarterly frequency. Hypothetical data has inherent limitations, some of which are disclosed in the Appendix.

Thoughts on Managed Futures (aka Trend-Following)

Some diversifiers might even help, especially when most needed

10 Worst 6-Month Periods for Private Equity

January 1, 1990 – March 31, 2023

6M Ending	Private Equity	Hypothetical Price Trend	Hypothetical Economic Trend	Hypothetical Combined Trend
Dec-2008	-22.0%	18.4%	35.7%	27.0%
Mar-2001	-12.5%	15.7%	3.3%	9.5%
Dec-2001	-9.0%	4.4%	14.8%	9.5%
Sep-2002	-7.6%	15.1%	24.5%	19.8%
Jun-2022	-5.3%	20.6%	35.2%	27.7%
Mar-2020	-5.1%	2.5%	-3.2%	-0.1%
Sep-1998	-2.2%	12.6%	20.4%	16.5%
Jun-2008	-2.1%	2.5%	4.6%	3.7%
Sep-2000	-1.5%	5.3%	-4.6%	0.2%
Dec-1986	-1.0%	3.4%	5.5%	4.5%
Average	-6.8%	10.0%	13.6%	11.8%

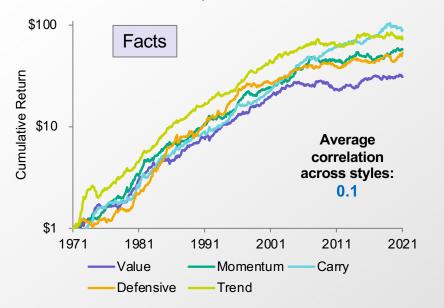


Living With Diversification

Make sure your diversifiers are themselves... diversified

Different Strategies Pay Off at Different Times

Cumulative Return, January 1, 1972 - December 31, 2021



Hypothetical Range of Outcomes

January 1, 1972 - December 31, 2021

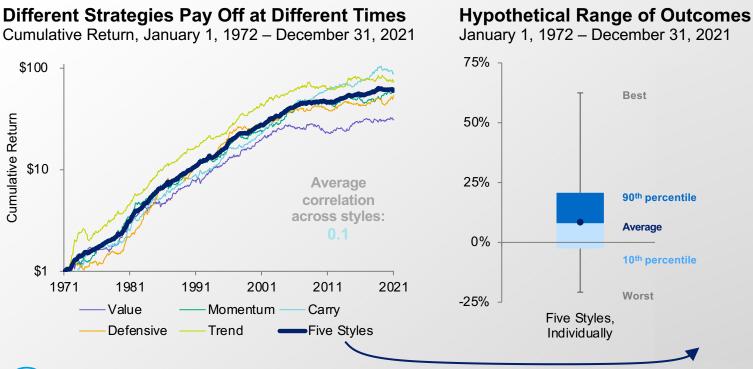




Source: AQR. Diversification does not eliminate the risk of experiencing investment losses. Value, Momentum, Carry, Defensive and Trend are heavily discounted backtests of alternative risk premia as described in the appendix. Five Styles is a simple average of the five styles depicted here. Please see Appendix for more details on the construction of the return series. Performance data quoted does not reflect the deduction of fees. If reflected, the fees would reduce the performance quoted. For illustrative purposes, does not represent strategies that AQR currently manages. No representation is being made that any investment will achieve performance similar to those shown. Hypothetical data has inherent limitations of which some are disclosed in the appendix. Please read important disclosures in the Appendix.

Living With Diversification

Make sure your diversifiers are themselves... diversified



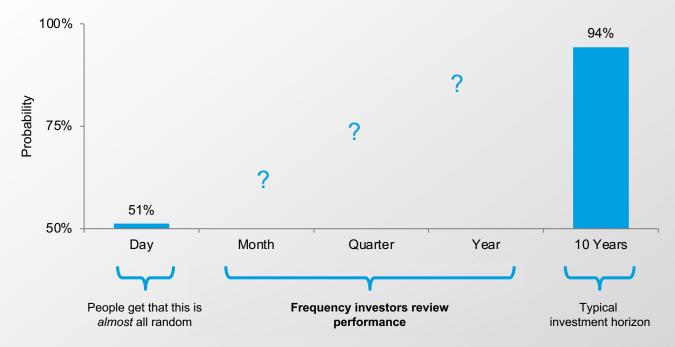


Source: AQR. Diversification does not eliminate the risk of experiencing investment losses. Value, Momentum, Carry, Defensive and Trend are heavily discounted backtests of alternative risk premia as described in the appendix. Five Styles is a simple average of the five styles depicted here. Please see Appendix for more details on the construction of the return series. Performance data quoted does not reflect the deduction of fees. If reflected, the fees would reduce the performance quoted. For illustrative purposes, does not represent strategies that AQR currently manages. No representation is being made that any investment will achieve performance similar to those shown. Hypothetical data has inherent limitations of which some are disclosed in the appendix. Please read important disclosures in the Appendix.

Setting Expectations

Sharpe ratios — though not perfect — can be useful

Probability of a 0.5 Sharpe Ratio Strategy Outperforming Cash

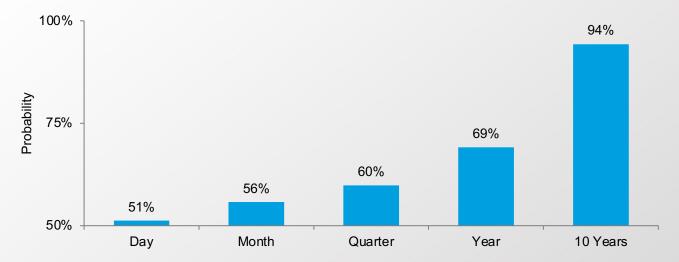




Setting Expectations

Sharpe ratios — though not perfect — can be useful

Probability of a 0.5 Sharpe Ratio Strategy Outperforming Cash





Concluding Thoughts

Do you have sufficient diversification to face the unknown?

- 1. What are the primary risks your portfolio is exposed to?
 - For most investors, equity and equity-related risks are dominant
 - Followed by interest rate risk
- 2. What to look for in a diversifying strategy:
 - Returns that are truly diversifying
 - Delivering returns when most needed
 - A diverse set of diversifiers





Appendix



What Helps When Things Turn Ugly

Relative value strategies can be pursued in many asset classes

	Momentum	Carry	Defensive
✓	✓		✓
✓	✓	✓	✓
✓	✓	✓	✓
✓	✓	✓	
✓	✓	✓	
	✓✓✓		





Disclosures



This document has been provided to you as a response to an unsolicited specific request and does not constitute an offer or solicitation of an offer or any advice or recommendation to purchase any securities or other financial instruments and may not be construed as such. The factual information set forth herein has been obtained or derived from sources believed by AQR Capital Management, LLC ("AQR") to be reliable but it is not necessarily all-inclusive and is not guaranteed as to its accuracy and is not to be regarded as a representation or warranty, express or implied, as to the information's accuracy or completeness, nor should the attached information serve as the basis of any investment decision. This document is intended exclusively for the use of the person to whom it has been delivered by AQR and it is not to be reproduced or redistributed to any other person.

Performance figures contained herein reflect the reinvestment of dividends and all other earnings and represent unaudited estimates of realized and unrealized gains and losses prepared by AQR Capital Management, LLC. There is no guarantee as to the above information's accuracy or completeness. Past performance is not a guarantee of future performance. All investments involve risk, including loss of principal. There is no guarantee, express or implied, that long-term return and/or volatility targets will be achieved. Realized returns and/or volatility may come in higher or lower than expected. Diversification does not eliminate the risk of experiencing investment losses.

Gross performance results do not reflect the deduction of investment advisory fees and other expenses, which would reduce an investor's actual return. AQR's asset based fees may range up to 2.85% of assets under management, and are generally billed monthly or quarterly at the commencement of the calendar month or quarter during which AQR will perform the services to which the fees relate. Where applicable, performance fees are generally equal to 20% of net realized and unrealized profits each year, after restoration of any losses carried forward from prior years. In addition, AQR funds incur expenses (including start-up, legal, accounting, audit, administrative and regulatory expenses) and may have redemption or withdrawal contains a proceeds. Please refer to AQR's ADV Part 2A for more information on fees. Consultants supplied with gross results are to use this data in accordance with SEC, CFTC, NFA or the applicable jurisdiction's quidelines.

HYPOTHETICAL PERFORMANCE RESULTS HAVE MANY INHERENT LIMITATIONS, SOME OF WHICH ARE DESCRIBED BELOW. NO REPRESENTATION IS BEING MADE THAT ANY FUND OR ACCOUNT WILL OR IS LIKELY TO ACHIEVE PROFITS OR LOSSES SIMILAR TO THOSE SHOWN HEREIN. IN FACT, THERE ARE FREQUENTLY SHARP DIFFERENCES BETWEEN HYPOTHETICAL PERFORMANCE RESULTS AND THE ACTUAL RESULTS SUBSEQUENTLY REALIZED BY ANY PARTICULAR TRADING PROGRAM. ONE OF THE LIMITATIONS OF HYPOTHETICAL PERFORMANCE RESULTS IS THAT THEY ARE GENERALLY PREPARED WITH THE BENEFIT OF HINDSIGHT. IN ADDITION, HYPOTHETICAL TRADING DOES NOT INVOLVE FINANCIAL RISK, AND NO HYPOTHETICAL TRADING RECORD CAN COMPLETELY ACCOUNT FOR THE IMPACT OF FINANCIAL RISK IN ACTUAL TRADING. FOR EXAMPLE, THE ABILITY TO WITHSTAND LOSSES OR TO ADHERE TO A PARTICULAR TRADING PROGRAM IN SPITE OF TRADING LOSSES ARE MATERIAL POINTS THAT CAN ADVERSELY AFFECT ACTUAL TRADING RESULTS. THERE ARE NUMEROUS OTHER FACTORS RELATED TO THE MARKETS IN GENERAL OR TO THE IMPLEMENTATION OF ANY SPECIFIC TRADING PROGRAM WHICH CANNOT BE FULLY ACCOUNTED FOR IN THE PREPARATION OF HYPOTHETICAL PERFORMANCE RESULTS, ALL OF WHICH CAN ADVERSELY AFFECT ACTUAL TRADING RESULTS. The hypothetical performance results contained herein represent the application of the quantitative models will remain the same in the future or that an application of the current models will remain the same in the future or that an application of the current models in the future will produce similar results because the relevant market and economic conditions that prevailed during the hypothetical performance period will not necessarily recur. Discounting factors may be applied to reduce suspected anomalies. This backtest's return, for this period, may vary depending on the date it is run. Hypothetical performance results are presented for illustrative purposes only. In addition, our transaction costs assumptions subject on the assumptions may have a material impact on the hypothetical returns presented. Actual advisory fees for products offering this strategy may v

"Expected" or "Target" returns or characteristics refer to expectations based on the application of mathematical principles to portfolio attributes and/or historical data, and do not represent a guarantee. These statements are based on certain assumptions and analyses made by AQR in light of its experience and perception of historical trends, current conditions, expected future developments and other factors it believes are appropriate in the circumstances, many of which are detailed herein. Changes in the assumptions may have a material impact on the information presented.

Sustainable investing is qualitative and subjective by nature, and there is no guarantee that the environmental, social and governance ("ESG") criteria utilized, judgment exercised, or techniques employed, by AQR will be successful, or that they will reflect the beliefs or values of any one particular investor. Certain information used to evaluate ESG factors or a company's commitment to, or implementation of, responsible practices is obtained through voluntary or third-party reporting, which may not be accurate or complete. ESG investing can limit the investment opportunities available to a portfolio, such as the exclusion of certain securities or issuers for nonfinancial reasons and, therefore, the portfolio may perform differently than or underperform other similar portfolios that do not apply ESG factors.



Broad-based securities indices are unmanaged and are not subject to fees and expenses typically associated with managed accounts or investment funds. Investments cannot be made directly in an index.

The S&P 500 Index is a market-capitalization-weighted index of 500 leading publicly traded companies in the U.S.

The Russell 2000 Index is a small-cap U.S. stock market index that makes up the smallest 2,000 stocks in the Russell 3000 Index.

The Russell 3000 Index is designed to track the performance of the 3,000 largest U.S. companies and represents approximately 96% of the investable U.S. equity market.

The MSCI World Index is a free float-adjusted market capitalization weighted index that is designed to measure the equity market performance of developed markets.

The Bloomberg Commodity Index is made up of 23 exchange-traded futures on physical commodities, representing 21 commodities which are weighted to account for economic significance and market liquidity.

The Cambridge US Private Equity Index is calculated based on data compiled from over 1,000 US private equity and venture capital funds.

Bloomberg Agg Total Return Index is a broad base, market capitalization-weighted bond market index representing intermediate term investment grade bonds traded in the United States. Investors frequently use the index as a stand-in for measuring the performance of the US bond market

The FTSE Nareit All Equity REITs Index is a free-float adjusted, market capitalization-weighted index of U.S. equity REITs. Constituents of the index include all tax-qualified REITs with more than 50 percent of total assets in qualifying real estate assets other than mortgages secured by real property.

The HFRI Fund Weighted Composite Index is a global, equal-weighted index of the largest hedge funds that report to the HFR Database which are open to new investments and offer quarterly liquidity or better. The index constituents are classified into Equity Hedge, Event Driven, Macro or Relative Value strategies.

MSCI USA Total Return Index is designed to measure the performance of the large and mid cap segments of the US market. With 627 constituents, the index covers approximately 85% of the free float-adjusted market capitalization in the US.

Request ID: 383888



Appendix: Current Environment

Macro news indicators and hypothetical strategy descriptions

Inflation and Growth Metrics:

We combine two measures of the "information content" of realized U.S. inflation:

- 1. year-on-year CPI inflation minus CPI for previous 1-year period ("change")
- 2. year-on-year CPI inflation minus 1-year forecast at start of period ("surprise")

We combine the two metrics (standardized so they have equal influence) to reduce noise in either one. We use quarterly overlapping year-on-year periods, to avoid seasonal effects and mitigate the role of publication lags. We construct a corresponding metric for U.S. GDP growth, as a control variable.



Appendix: What Could Go Wrong?

Asset descriptions for scenario analysis

Asset Class	Proxy 1	Start Date	Proxy 2	Start Date
Public Equities	Russell 3000 Total Return Index	1/1/1979	MSCI USA Total Return Index	1/1/1972
Fixed Income	Bloomberg US Agg Total Return Index	2/1/1976	AQR US Bond Series	1/1/1972
Real Estate	FTSE NAREIT All Equity REITs Index	1/1/1972		
Private Equity	1.2x Russell 2000 Total Return Index	1/1/1979	1.3x MSCI USA Total Return Index	1/1/1972
Hedge Funds	HFRI Fund Weighted Composite Index	1/1/1990	HFRI Fund Weighted Composite Index	1/1/1990
Commodities	Bloomberg Commodity Index Total Return	1/1/1972		
Cash	Carry on 3m T-Bills	1/1/1972		



Source: AQR

Appendix: What Helps When Things Turn Ugly

Data sources and definitions

Factor Premia Asset Data

U.S. Stocks: Individual stock-level data from the CRSP database from July 1926 for Value, July 1927 for Momentum, and July 1931 for Defensive strategies.

Equity Indices: Returns on equity indices from 23 equity markets international which include all countries in the MSCI World Index as of 10/31/2016. Since most countries have multiple equity indices, we use the index that is investable, has the most coverage of the total stock market of that country, and has the longest history. We source monthly total returns from Global Financial Data and futures returns from Bloomberg and Datastream.

Fixed Income: Nominal yield and total returns data of 10-year local currency government bonds as well as 3-month interest rates for 13 countries covering North America, Northern Europe, Japan, and Australia/New Zealand, sourced from Global Financial Data, Bloomberg, and Datastream.

Currencies: Spot and 1-, 2-, 3-, and 6-month forward exchange rates from AQR's production data base and interpolate the forward exchange rate for the next quarterty IMM date. This simulates a strategy of buying and holding the forward contract maturing at the near IMM date and rolling to the far contract 5 days before the maturity date. Before 1990, we use changes in spot exchange rates plus the carry of the currency for the total return. This includes data from 20 developed market currencies (Australia, Eurozone, Canada, Japan, Norway, New Zealand, Sweden, Switzerland, United Kingdom, and the U.S., and Belgium, Spain, Finland, France, Germany, Ireland, Italy, Netherlands, Austria, and Portugal).

Commodities: Monthly futures prices of 40 commodities starting in 1877, sourced from the Annual Report of the Trade and Commerce of the Chicago Board of Trade, Commodity Systems Inc., and Bloomberg. For base metals and platinum, rolled return series from the S&P, Goldman Sachs, and Bloomberg are used.

U.S. Equity Market Data: Prior to 1926, the U.S. Equity series is constructed by adding price-weighted capital appreciation returns of NYSE stocks collected by Goetzmann, Ibbotson, and Peng to U.S. equity dividend returns recorded by the Cowles commission. The series consists of returns of the S&P 90 from 1926 to 1957 and returns of the S&P 500 from 1957 onwards.

Global Equities: GDP-weighted return of equity index futures of 11 developed countries.

Global Fixed Income: GDP-weighted return of 15 government bond indices of 8 developed countries scaled to a constant duration of 4 years.

Factor Premia Definitions

U.S. Stocks: Value: Book-to-Price Ratio; Momentum: Past 12 Month Return, Excluding Last Month; Defensive: Beta

Equity Indices: Value: Cyclically-Adjusted Earnings-to-Price Ratio; Momentum: Past 12 Month Return, Excluding Last Month; Carry: Dividend Yield; Defensive: Beta

Fixed Income: Value: Real Bond Yield; Momentum: Past 12 Month Return, Excluding Last Month; Carry: Term Premium; Defensive: Beta Currencies: Value: Purchasing Power Parity: Momentum: Past 12 Month Return, Excluding Last Month: Carry: Short Term Interest Rate

Commodities: Value: 5 Year Reversal; Momentum: Past 12 Month Return, Excluding Last Month; Carry: Futures Curve Rolldown; Defensive: Beta

Multi-style is an equal weighted portfolio of the factor premia within each asset class.

The multi-asset multi-style composite is based on equal risk weights across asset classes, using long-run volatilities; it also includes a shorter history of International Stocks.



Source: AQR, Global Financial Data, Bloomberg, Datastream, Chicago Board of Trade, Commodity Systems Inc. The full sample period starts in 1/1920 (all assets become available in 1920s except for currencies in 1974). All factor premia reflect a backtest of theoretical long/short style components based on AQR definitions applied in several asset group contexts. The results shown do not include advisory fees or transaction costs but are in excess of cash (US treasury bills).

Hypothetical Price-Based Trend-Following Strategy Academic Backtest Construction

The Hypothetical Price-Based Trend-Following Strategy model uses data from January 1880 onward. The investment strategy is based on trend-following investing which involves going long markets that have been rising and going short markets that have been falling, betting that those trends over the examined look-back periods will continue. The strategy was constructed with an equal-weighted combination of 1-month, 3-month, and 12-month trend-following strategies for 67 markets across 4 major asset classes: 29 commodities, 11 equity indices, 15 bond markets, and 12 currency pairs. Since not all markets have return data going back to 1880, we construct the strategies using the largest number of assets for which return data exist at long-term volatility target of 10% but does not limit volatility during periods where realized volatility may be higher or lower than this number.

Hypothetical performance is gross of advisory fees and net of transaction costs, unless stated otherwise. In order to calculate net-of-fee returns, we subtracted a 1.25% annual management fee and a 20% performance fee from the gross-of-fee, net-of-transaction-cost returns to the strategy. The transactions costs used in the strategy are based on proprietary estimates of average transaction costs for each of the four asset classes, including market impact and commissions. The transaction costs are assumed to be twice as high from 1993 to 2002 and six times as high from 1880–1992. The transaction costs used are shown in Figure 1.

This model is not based on an actual portfolio AQR manages.

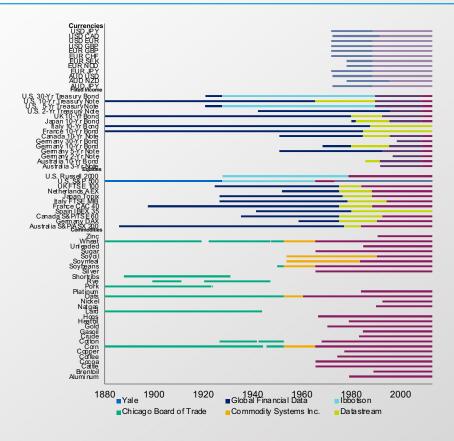
The benchmark and relevant cash rate is assumed to be ICE BofA 3-Month T-Bill. Prior to 1929 when 3-month Treasury bills became available, the benchmark and relevant cash rate is assumed to be the NYSE call money rates (the rates for collateralized loans) through 1920 and returns on short-term government debt (certificates of indebtedness) from 1920 until 1929.

Figure 1

Asset Class	Time Period	One-Way Transaction Costs (as a % of notional traded)
	1880 – 1992	0.34%
Equities	1993 – 2002	0.11%
	2003 - Present	0.06%
	1880 – 1992	0.06%
Fixed Income	1993 – 2002	0.02%
	2003 - Present	0.01%
	1880 – 1992	0.18%
Currencies	1993 – 2002	0.06%
	2003 - Present	0.03%
	1880 – 1992	0.58%
Commodities	1993 – 2002	0.19%
	2003 - Present	0.10%



Figure 2





Hypothetical Economic Trend-Following Strategy Academic Backtest Construction

The Hypothetical Economic Trend-Following Strategy uses data from January 1970 onward. The investment strategy is based on trend following which for each theme (Growth, Inflation, International Trade, Monetary Policy, Risk Aversion) and within each asset class, takes a long position in assets in which economic trends are deteriorating. Each individual position is sized to target the same amount of volatility, both to provide diversification and to limit the portfolio risk from any individual market. The theme portfolio across all assets is scaled to target 10% forecasted annual volatility.

Not all markets and assets have returns going back to 1970; details outlined on the following page.

Growth: Growth trends are captured using one-year changes in forecasts of real GDP growth. From 1990 onward forecast data is from Consensus Economics. Prior to 1990, we use one-year changes in realized year-on-year real GDP growth, lagged one quarter (this definition is equivalent to changes in forecasts assuming that real GDP growth follows a random walk). The series is from the OECD. Increasing growth is assumed to be bullish for equities (cash-flow impact), commodities (increasing demand), and currencies (Balassa-Samuelson hypothesis), and bearing income (both qovernment bonds and interest rates) via both inflationary pressures and upward pressure on real interest rates.

Inflation: Inflation trends are captured using one-year changes in forecasts of CPI inflation, lagged one quarter (this definition is equivalent to changes in forecasts assuming that CPI inflation follows a random walk). The series is from the OECD. Increasing inflation is assumed to be bearish for equities (see Katz and Lustig (2017)), bullish for currencies (see Clarida and Waldman (2008)), and bearish for fixed income.

International Trade: International trade trends are captured using one-year changes in spot exchange rates against an export-weighted basket. Data is from DataStream. A depreciating currency is bullish for equities (exports become more competitive), bearish for currencies (very similar to price momentum), bearish for fixed income (other things equal, a depreciating currency reduces the pressure on a central bank to reduce interest rates), and bearish for commodities (depreciation of the currencies of commodity consumers means commodities, which are generally priced in USD, are effectively more expensive).

Monetary Policy: Monetary policy trends are captured using one-year changes in the front end of the yield curve. From 1992 onwards, I use two-year yields, while prior to 1992 I use Libor and its international equivalents. Both data series are from Bloomberg. Expansionary monetary policy is bullish for equities (see Bernanke and Kuttner (2005)), bullish for currencies (see Eichenbaum and Evans (1995)), bullish for commodities, and bearish for fixed income.

Risk Sentiment: Changes in risk sentiment are captured using one-year equity market excess returns. Data is from DataStream. Increasing risk sentiment — i.e., strong equity market returns — is bullish for equities, commodities, and currencies, and bearish for fixed income.

The model employs relatively simple measures as they afford long data availability and are less susceptible to concerns about data mining. The strategy is therefore intended as a proof of concept, and can potentially be enhanced by employing additional and improved measures of economic trends.

Backtest returns are hypothetical gross of transaction costs and fees. Even after adjusting for transaction costs and fees, backtest returns are likely overstated, despite best effort to employ simple and transparent signals, due to unavoidable hindsight bias. Hypothetical data has inherent limitations, some of which are disclosed herein.

As the backtest is constructed to take a long position in assets in which economic trends are improving and a short position in assets in which economic trends are deteriorating, the strategy would likely underperform in a period of sharp reversals across asset classes and investment themes or in an environment in which price trends and economic trends diverge. However, due in part to the diversification benefits of the four asset classes and four investment themes, the performance of the backtest has been consistent over a wide variety of macroeconomic and financial environments over the last 50 years.

Limitations of Backtested Performance. The returns presented reflect hypothetical performance an investor would have obtained had it invested in the manner shown and does not represents returns that any investor actually attained. The information presented is based upon the following hypothetical assumptions.



Hypothetical Economic Trend-Following Strategy Universe:

Equity index return data is from Bloomberg. Start dates are the earliest available date of the series:

- 1970: Australia, Germany, Canada, Spain, France, Italy, Japan, Netherlands, U.K., U.S.
- · 1975: Switzerland
- · 1980: Denmark, Hong Kong, Sweden
- 1988: New Zealand

Government bond return data is from Bloomberg and DataStream. Start dates are

- · 1970: Germany, Canada, U.K., U.S.
- 1980: Japan
- · 1981: Switzerland
- 1985: Denmark
- · 1986: Australia
- 1987: Sweden

Currency return data is from Citi and Reuters. Start dates are

- · 1971: Germany, Japan, Switzerland, U.K.
- · 1972: Australia, Canada
- · 1978: New Zealand, Sweden

Interest rate futures return data is from IFS. Start dates are

- 1987: U.S.
- 1988: U.K.
- 1989: Australia, Europe (Euribor)
- · 1991: Canada, New Zealand, Switzerland

Commodity futures return data is from Bloomberg. Start dates are

- 1970: Cattle, Corm Cotton, Hogs, Soybeans, Soymeal, Soyoil, Sugar, Wheat
- 1974: Coffee
- 1979: Heat Oil
- 1983: Crude Oil
- 1984: Gas Oil
- 1985: Unleaded
- 1989: Brent Oil
- 1990: Natural Gas
- 1991: Zinc
- 1993: Nickel



Hypothetical Alternative Risk Premia (ARP) Strategy Description:

The strategy is an equal-weighted combination of five discounted multi-asset long/short factors - value, momentum, carry, defensive and trend - scaled to 8% volatility and net of 2% management fee.

The long/short factors are hypothetical strategies as described in Ilmanen, Maloney and Ross (2014), discounted to account for transaction costs and real-world constraints. Each series is scaled to realize 8% volatility.

The four market-neutral multi-asset factor premia (value, momentum, carry and defensive – as described below) are hypothetical long/short strategies applied in stock selection, industry allocation, country allocation in equity, fixed income and currency markets, and commodities. Each factor allocates 50/50 risk weights to stock and industry selection (SS) and asset allocation (AA) strategies. For AA we use the following risk weights: 33% equity country allocation, 25% fixed income, 25% currencies, 17% commodities. We combine several data sources to produce a sufficiently long dataset:

- Since 1990, we use factor premia strategies as described below, and with further detail in "Investing With Style" (2012). These series incorporate t-costs, constraints and discounting. For SS carry we use the dividend yield strategy returns in Ken French's data library.
- For 1972-1989, we source value and momentum factor returns from "Value and Momentum Everywhere" (Journal of Finance, 2013), defensive factor returns from "Betting Against Beta" (Journal of Financial Economics, 2013), and SS carry from the dividend yield strategy returns in Ken French's data library. AA carry factor premia before 1990 as well as some early histories of AA value, momentum and defensive factors are hypothetical strategies similar to those described above, but over a narrower universe. We discount returns by 50% to account for t-costs and real-world constraints.

The SS factor premia proxies we use since 1990 are beta-neutral. The value and momentum premia before 1990, and the SS carry premium throughout, are dollar-neutral. The defensive factor premia are beta-neutral throughout.

Additional details on the construction of the four market-neutral multi-asset factor premia:

- Value means buying assets that are "cheap" relative to their fundamental value and selling "expensive" assets. In stocks this is some measure of fundamental value relative to price e.g., B/P. For bonds we use a measure of real bond yields, and for currencies and commodities a measure of 5-year reversal in price, reflecting mean reversion. In all cases, a systematic process that first sorts assets by these measures, going long the cheap (relative to fundamentals) assets and short the expensive ones, is applied.
- Momentum involves buying assets that recently outperformed their peers and selling those that recently underperformed. The typical approach is to look at the past 12 months of returns for a universe of assets, going long the ones that have outperformed their peers and short the underperformers.
- Carry implies buying high-yielding assets and selling low-yielding assets. In currency markets we sort countries by their short term (say, 3-month) lending rate, and go long the countries with the highest rates and short the markets with the lowest. Likewise, in fixed income and commodity futures, where backwardation or contango are exploited across various commodities. For stocks, the carry earned is the expected dividend yield for which we use Ken French data as described above.
- Defensive consists of buying low-risk, high-quality assets and selling high-risk, low-quality assets. In the case of stocks, we sort by forecasted betas and go long the stocks with the lowest betas and short the ones with the highest betas. We also go beyond beta to include more fundamental measures of risk—or conversely "quality"—by seeking high profitability, low leverage, and stable earnings among stocks, or favoring short-duration assets in fixed income.

The fifth multi-asset factor is Trend. The multi-asset trend factor applies 12-month trend-following strategies in four asset classes: equities, fixed income, currencies and commodities. From 1985, we use "Time Series Momentum" (Journal of Financial Economics, 2012). For 1972-1984 trend is a hypothetical strategy based on the same asset classes, but including 1-, 3- and 12-month momentum, and starting with a smaller asset universe that grows during the period as more assets become available.



Trend-Following Strategy

The Hypothetical Trend-Following Strategy model uses data from January 1880 onward. The investment strategy is based on trend-following investing which involves going long markets that have been rising and going short markets that have been falling, betting that those trends over the examined look-back periods will continue. The strategy was constructed with an equal-weighted combination of 1-month, 3-month, and 12-month trend-following strategies for 67 markets across 4 major asset classes: 29 commodities, 11 equity indices, 15 bond markets, and 12 currency pairs. Since not all markets have return data going back to 1880, we construct the strategies using the largest number of assets for which return data exist at each point in time. We use futures returns when they are available. Prior to the availability of futures data, we rely on cash index returns financed at local short rates for each country. Please see Figure 2 for additional details. The strategy targets a long-term volatility target of 10% but does not limit volatility during periods where realized volatility may be higher or lower than this number.

Hypothetical performance is gross of advisory fees and net of transaction costs, unless stated otherwise. In order to calculate net-of-fee returns, we subtracted a 2% annual management fee and a 20% performance fee from the gross-of-fee, net-of-transaction-cost returns to the strategy. Actual fees may vary depending on, among other things, the applicable fee schedule. AQR's fees are available upon request and also may be found in Part 2A of its Form ADV. The transactions costs used in the strategy are based on AQR's estimates of average transaction costs for each of the four asset classes, including market impact and commissions. The transaction costs are assumed to be twice as high from 1993 to 2002 and six times as high from 1880–1992. The transaction costs used are shown in Figure 1.

This model is not based on an actual portfolio AQR manages. The performance of the AQR Managed Futures Strategy may be greater or less than the performance of the Trend-Following Strategy due to, among other things, differences in the investment strategy pursued by the AQR Managed Futures Strategy and the number of the holdings in and composition of the AQR Managed Futures Strategy's portfolio.

The benchmark and relevant cash rate is assumed to be 3-month Treasury bills. Prior to 1929 when 3-month Treasury bills became available, the benchmark and relevant cash rate is assumed to be the NYSE call money rates (the rates for collateralized loans) through 1920, and returns on short-term government debt (certificates of indebtedness) from 1920 until 1929.

Figure 1

Asset Class	Time Period	One-Way Transaction Costs (as a % of notional traded)
	1880 – 1992	0.34%
Equities	1993 – 2002	0.11%
	2003 - Present	0.06%
	1880 – 1992	0.06%
Fixed Income	1993 – 2002	0.02%
	2003 – Present	0.01%
	1880 – 1992	0.18%
Currencies	1993 – 2002	0.06%
	2003 - Present	0.03%
	1880 – 1992	0.58%
Commodities	1993 – 2002	0.19%
	2003 - Present	0.10%



