BEWARE OF GEEKS BEARING FORMULAS

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Affordable Active Alpha | Built to Beat Behavioral Bias | We Empower Investors Through Education

Who Can Predict Market Trends?



Presentation Outline

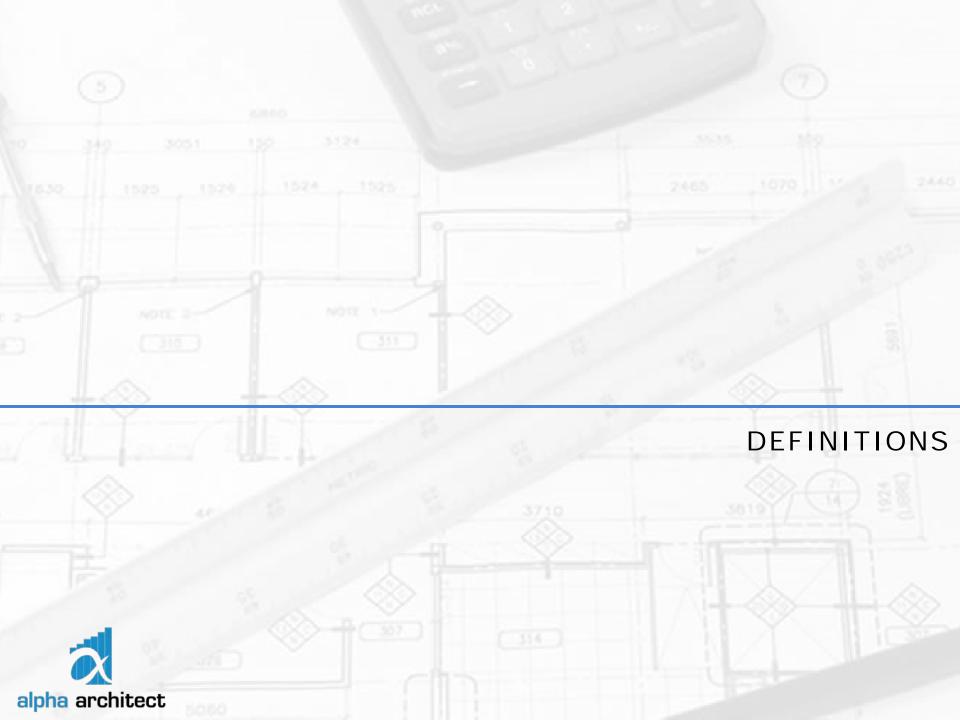
- Tactical Asset Allocation
 - Definition
 - Basic Asset Classes
 - Common Concepts
- Academic Evidence
 - Out of Sample Performance
 - Why Complexity Doesn't Add Value
- Performance of Common Concepts
 - Background
 - Historical Performance
- > <u>Appendix</u>
 - Statistics Descriptions
 - Disclosures





TACTICAL ASSET ALLOCATION





Allocation

Our baseline allocation to our asset universe

□ E.g., 50% Stocks, 50% Bonds, rebalanced annually

≻Asset

Financial assets that can be traded with reasonable liquidity
E.g., Stocks, Bonds, Commodities, Alternatives (if liquid)

≻Tactical

□ Changing our baseline allocation

 \Box E.g., 50% Stocks, 50% Bonds \rightarrow 30% Stocks, 70% Bonds



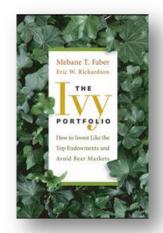
BASIC ASSET CLASSES



The Basic Diversified Portfolio

The "IVY 5" Concept							
Domestic Equity	International Equity	Real Estate	Commodities	Fixed Income			
\checkmark \checkmark	\checkmark \checkmark	\checkmark \checkmark	\checkmark \checkmark	\vee \vee			
20%	20%	20%	20%	20%			

- 1. SP500 = SP500 Total Return Index
- **2. EAFE** = MSCI EAFE Total Return Index
- **3. REIT** = FTSE NAREIT All Equity REITS Total Return Index
- 4. **GSCI** = GSCI Index
- 5. LTR = Merrill Lynch 7-10 year Government Bond Index



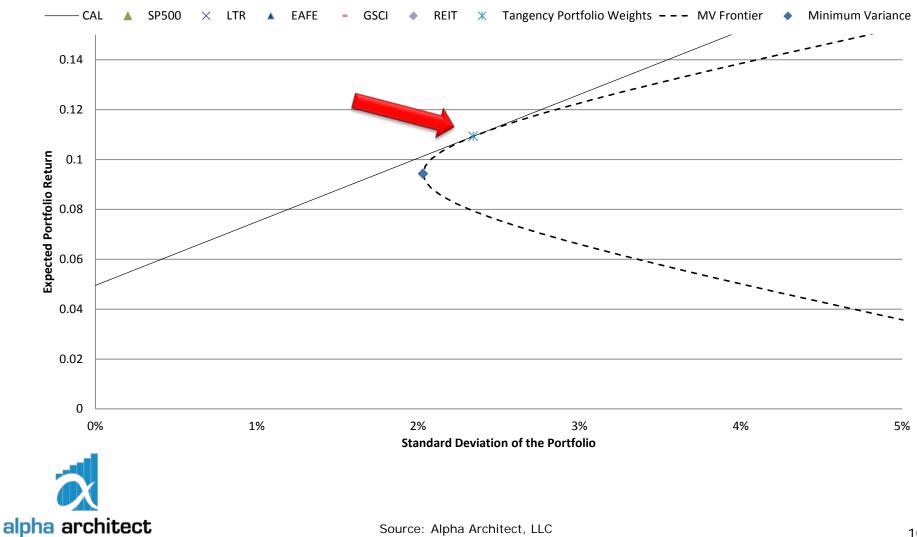


COMMON ASSET ALLOCATION TECHNIQUES



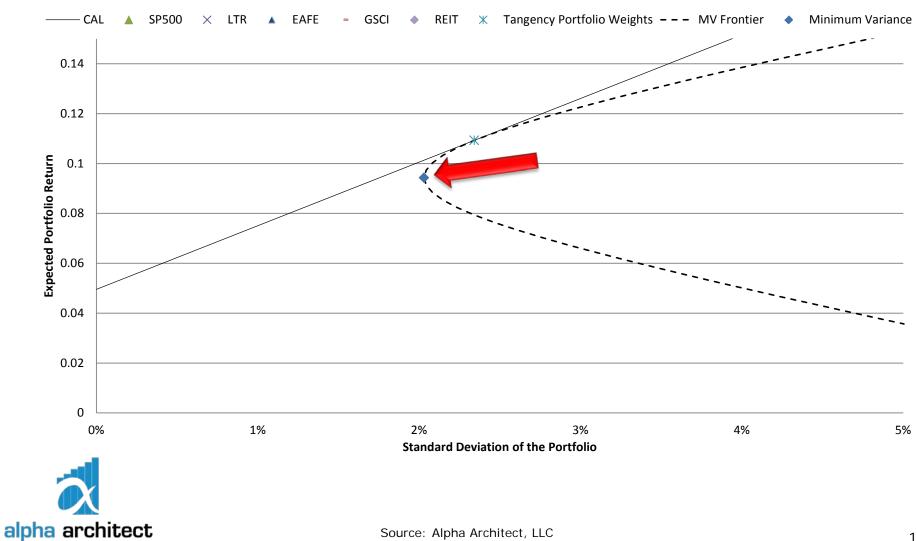
Tangency Portfolio or Max Sharpe Portfolio

- ➤ Tangency (Max Sharpe) Portfolio → value-weight portfolio of all risky assets
- > Identify weights that maximize Sharpe Ratio



Minimum Variance Portfolio

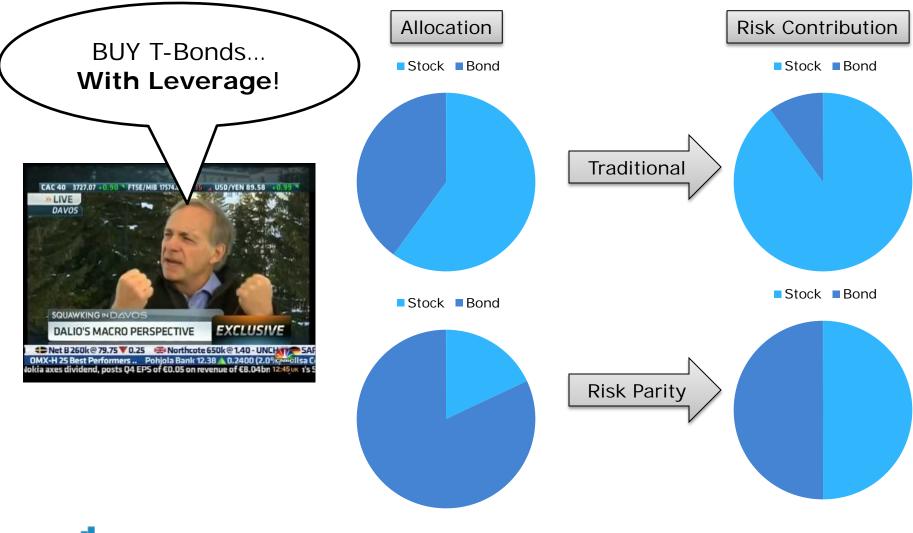
> Identify weights that minimize portfolio variance



Source: Alpha Architect, LLC

Risk Parity

> Identify weights that equalize "risk" across asset classes

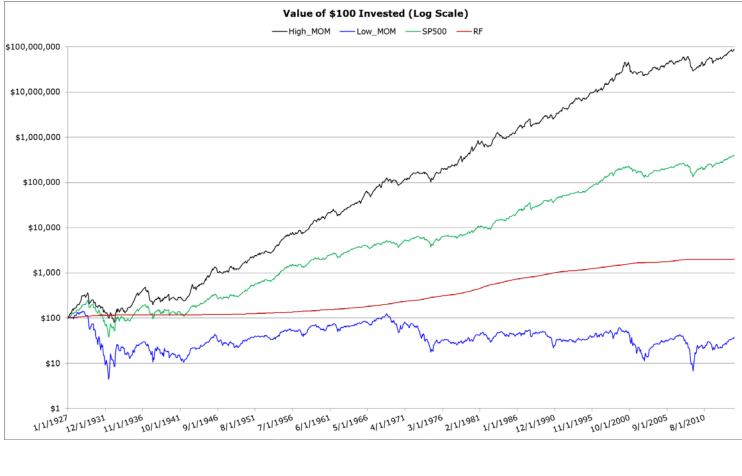




Momentum Portfolio

>Quotes from Eugene Fama and Ken French

- "...momentum is pervasive."
- "The premier anomaly is momentum..."





Moving Average Rule Portfolio

Classic Trend Following Strategy

♦IF MA rule triggered, buy risk, else, cash out.

E.g., Compare current price to the Average (past 12 months)



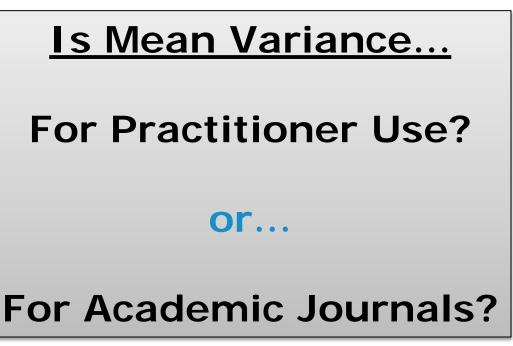




ACADEMIC EVIDENCE







"The Motivation behind my dissertation was to apply mathematics to the stock market."

Harry Markowitz, intellectual founder of Mean Variance Analysis

"This is not a dissertation in economics, and we cannot give you a PhD in economics for this."





Source: Data-Driven Investment Management Presentation at the International Conference on Computational Management Science, May 2014, Victor DeMiguel

OUT-OF-SAMPLE PERFORMANCE 2 alpha architect

Academic Model Performance

Table 3

"Of the 14 models we evaluate across seven empirical datasets, <u>none is consistently better than the 1/N rule</u> <u>in terms of Sharpe ratio, certainty-equivalent return, or turnover</u>, which indicates that, out of sample, the gain from optimal diversification is more than offset by estimation error..."

Strategy	S&P sectors $N = 11$	Industry portfolios $N = 11$	Inter'l portfolios $N = 9$	Mkt/SMB/HMLN = 3	FF 1-factor N = 21	FF 4-factor N = 24
1/N	0.1876	0.1353	0.1277	0.2240	0.1623	0.1753
mv (in sample)	0.3848	0.2124	0.2090	0.2851	0.5098	0.5364
mv	0.0794	0.0679	-0.0332	0.2186	0.0128	0.1841
	(0.12)	(0.17)	(0.03)	(0.46)	(0.02)	(0.45)
bs	0.0811	0.0719	-0.0297	0.2536	0.0138	0.1791
	(0.09)	(0.19)	(0.03)	(0.25)	(0.02)	(0.48)
dm ($\sigma_{\alpha} = 1.0\%$)	0.1410	0.0581	0.0707	0.0016	0.0004	0.2355
	(0.08)	(0.14)	(0.08)	(0.00)	(0.01)	(0.17)
min	0.0820	0.1554	0.1490	0.2493	0.2778	-0.0183
	(0.05)	(0.30)	(0.21)	(0.23)	(0.01)	(0.01)
VW	0.1444	0.1138	0.1239	0.1138	0.1138	0.1138
	(0.09)	(0.01)	(0.43)	(0.00)	(0.01)	(0.00)
mp	0.1863	0.0533	0.0984	-0.0002	0.1238	0.1230
	(0.44)	(0.04)	(0.15)	(0.00)	(0.08)	(0.03)
mv-c	0.0892	0.0678	0.0848	0.1084	0.1977	0.2024
	(0.09)	(0.03)	(0.17)	(0.02)	(0.02)	(0.27)
bs-c	0.1075	0.0819	0.0848	0.1514	0.1955	0.2062
	(0.14)	(0.06)	(0.15)	(0.09)	(0.03)	(0.25)
min-c	0.0834	0.1425	0.1501	0.2493	0.1546	0.3580
	(0.01)	(0.41)	(0.16)	(0.23)	(0.35)	(0.00)
g-min-c	0.1371	0.1451	0.1429	0.2467	0.1615	0.3028
	(0.08)	(0.31)	(0.19)	(0.25)	(0.47)	(0.00)
mv-min	0.0683	0.0772	-0.0353	0.2546	-0.0079	0.1757
	(0.05)	(0.21)	(0.01)	(0.22)	(0.01)	(0.50)
ew-min	0.1208	0.1576	0.1407	0.2503	0.2608	-0.0161
	(0.07)	(0.21)	(0.18)	(0.17)	(0.00)	(0.01)

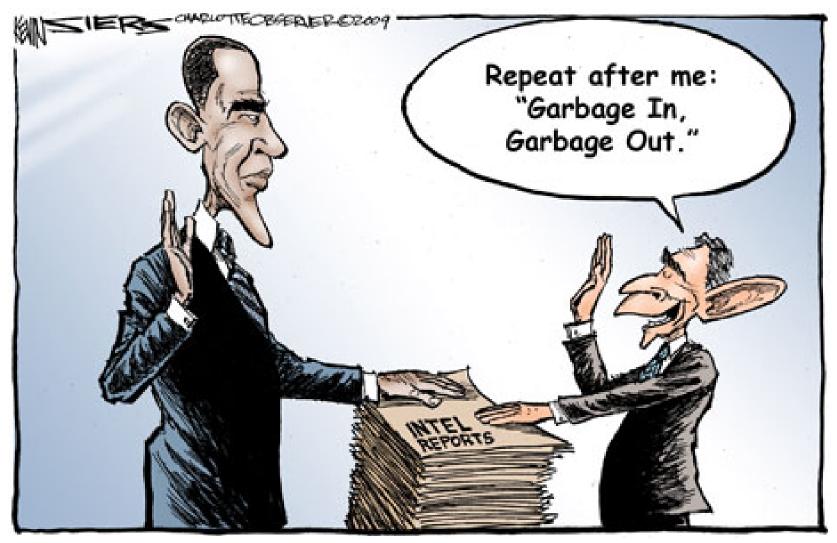


*The results are hypothetical results and are NOT an indicator of future results and do NOT represent returns that any investor actually attained. Please see disclosures for additional information. Additional information regarding the construction of these results is available upon request. Indexes are unmanaged, do not reflect management or trading fees, and one cannot invest directly in an index.

Source: DeMiguel, V., L. Garlappi, and R. Uppal, 2009, *Optimal Versus Naïve Diversification: How Inefficient is the 1/N Portfolio Strategy*? Review of Financial Studies 5, 1915-1953.

WHY COMPLEXITY DOESN'T ADD VALUE







LTR 0.59% 2.36%

LTR 16.91% 0.44% 100.00%

> Summary	Summary Stats: Jan 1927 to Dec 1960			> Summary	y Stats: Jan 196	51 to Dec 2013
	SP500	HML	LTR		SP500	HML
Average	1.00%	0.36%	0.26%	Average	0.91%	0.40%
Std. Dev.	7.04%	4.42%	1.26%	Std. Dev.	4.32%	2.83%
Correlation	SP500	HML	LTR	Correlation	SP500	HML
SP500	100.00%	58.93%	5.64%	SP500	100.00%	-26.41%
HML	58.93%	100.00%	4.03%	HML	-26.41%	100.00%
LTR	5.64%	4.03%	100.00%	LTR	16.91%	0.44%

Tangency/Min.Var Weights: Jan 1927 to Dec 1960

> Tangency/Min.Var Weights: Jan 1961 to Dec 2013

	Tangency Weights	Min. Var. Weights		Tangency Weights	Min. Var. Weights
W(SP500)	17.92%	-0.55%	W(SP500)	41.22%	18.37%
W(HML)	-5.81%	7.07%	W(HML)	15.27%	38.95%
W(LTR)	87 <u>.9</u> 0%	93.48%	W(LTR)	43.51%	42.68%
				3	3

> Out of Sample Performance: 1961 to 2013 (using 1927 to 1960 weight estimates)

1961-2013	Equal Weights	Tangency	Min. Var.
CAGR	7.64%	7.83%	6.81%
Worst Drawdown	-19.90%	-18.14%	-19.90%
Sharpe Ratio	0.73	0.60	0.51
Sortino Ratio	0.64	0.58	0.40





PERFORMANCE OF COMMON TECHNIQUES



Strategy Background

- Simulated Historical Performance: 1/1/1979 to 12/31/2013
- > Results are gross of management fee and transaction costs for illustrative purposes only.
- > These are simulated performance results and do not reflect the returns an investor would actually achieve.
- > All returns are total returns and include the reinvestment of distributions (e.g., dividends).
- Max Sharpe weights are constrained between -1 and 1
- > Data is from Bloomberg and publicly available sources.
- ➤ Legend
 - 1. **SP500** = SP500 Total Return Index
 - 2. EAFE = MSCI EAFE Total Return Index
 - 3. **REIT** = FTSE NAREIT All Equity REITS Total Return Index
 - 4. **GSCI** = GSCI Index
 - 5. LTR = Merrill Lynch 7-10 year Government Bond Index (prior to 6/1982, Amit Goyal Data)
 - 6. **RISK_PARITY** = Risk parity on core 5 asset classes, 3-yr rolling windows
 - 7. MOM_TAA = Momentum on core 5 asset classes, 12-month momentum,
 - 8. MAX_SHARPE = Tangency portfolio weights on core 5 asset classes, 3-yr rolling windows (weights constrained [-1,1])
 - 9. MIN_VAR= Minimum variance portfolio weights on core 5 asset classes, 3-yr rolling windows
 - 10. EW_INDEX = Equal-weight, monthly rebalanced across core 5 asset classes
 - 11. EW_INDEX_MA = Equal-weight, monthly rebalanced across core 5 asset classes, with 12-month moving average rule
 - 12. RANDOM = 1/4 random chance of moving to risk-free rate, monthly rebalanced across core 5 asset classes
- Hypothetical performance results have many inherent limitations, some of which, but not all, are described in the disclosures at the end of this document. 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.
- > Indexes are unmanaged, do not reflect management or trading fees, and one cannot invest directly in an index.
- > Please see the disclosures at the end of this document for additional information.



HISTORICAL PERFORMANCE



> Summary Statistics: Benchmarks

Summary Statistics	SP500	EAFE	REIT	GSCI	LTR
CAGR	12.12%	9.38%	12.68%	6.62%	8.95%
Standard Deviation	15.27%	17.47%	17.50%	19.29%	8.66%
Downside Deviation (MAR=5%)	11.36%	12.39%	14.79%	13.47%	5.39%
Sharpe Ratio	0.51	0.32	0.50	0.18	0.47
Sortino Ratio (MAR=5%)	0.67	0.45	0.58	0.24	0.74
Worst Drawdown	-50.21%	-56.68%	-68.30%	-67.65%	-20.97%
Worst Month Return	-21.58%	-20.18%	-31.67%	-28.20%	-8.41%
Best Month Return	13.52%	15.58%	31.02%	22.94%	15.23%
Profitable Months	63.81%	60.00%	61.19%	56.67%	64.52%

Fixed Income

Domestic Equity

Real Estate

International Equity

Commodities



Summary Statistics: Asset Allocation with Core 5

Summary Statistics	EW_INDEX	RANDOM
CAGR	10.78%	9.40%
Standard Deviation	10.47%	8.38%
Downside Deviation (MAR=5%)	9.20%	7.40%
Sharpe Ratio	0.57	0.52
Sortino Ratio (MAR=5%)	0.64	0.59
Worst Drawdown	-46.27%	-35.28%
Worst Month Return	-19.60%	-14.58%
Best Month Return	9.96%	9.08%
Profitable Months	68.38%	69.51%



Summary Statistics	RISK_PARITY	MOM_TAA	MAX_SHARPE	MIN_VAR	EW_INDEX_MA
CAGR	10.86%	12.33%	8.89%	8.53%	11.19%
Standard Deviation	8.30%	10.67%	17.79%	7.16%	7.35%
Downside Deviation (MAR=5%)	6.87%	9.40%	14.68%	4.99%	5.87%
Sharpe Ratio	0.70	0.69	0.30	0.50	0.82
Sortino Ratio (MAR=5%)	0.83	0.77	0.35	0.69	1.01
Worst Drawdown	-30.12%	-45.01%	-47.51%	-18.05%	-11.67%
Worst Month Return	-13.13%	-19.63%	-25.82%	-8.42%	-9.84%
Best Month Return	7.84%	9.53%	19.87%	14.20%	7.37%
Profitable Months	70.24%	70.48%	59.76%	66.90%	72.14%



> Summary Statistics: Asset Allocation with Core 4 (no 10-Years)

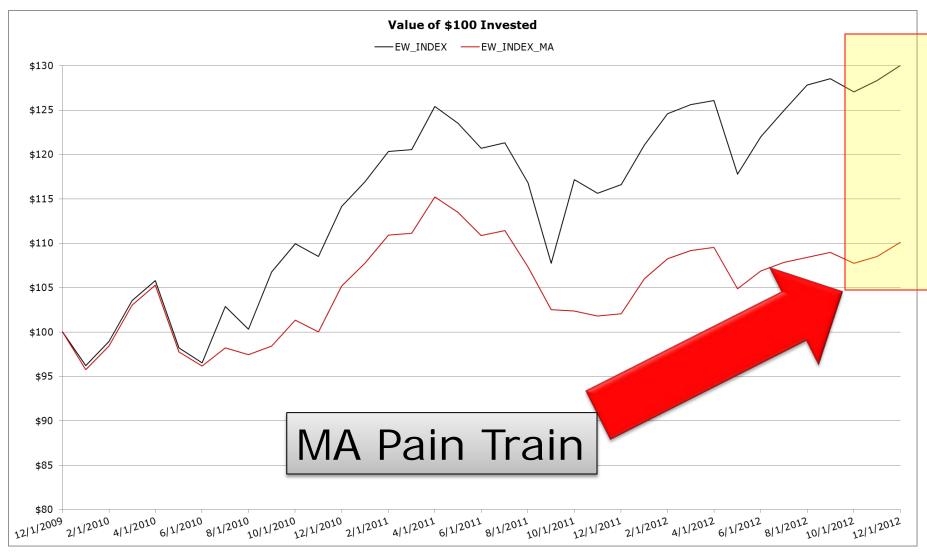
Summary Statistics	EW_INDEX	RANDOM
CAGR	10.88%	9.66%
Standard Deviation	12.76%	10.22%
Downside Deviation (MAR=5%)	11.48%	9.31%
Sharpe Ratio	0.50	0.47
Sortino Ratio (MAR=5%)	0.54	0.53
Worst Drawdown	-56.03%	-45.32%
Worst Month Return	-24.19%	-18.67%
Best Month Return	13.08%	11.42%
Profitable Months	67.40%	68.09%



Summary Statistics	RISK_PARITY	MOM_TAA	MAX_SHARPE	MIN_VAR	EW_INDEX_MA
CAGR	11.08%	11.72%	11.04%	10.41%	11.74%
Standard Deviation	12.47%	12.94%	20.01%	11.72%	8.86%
Downside Deviation (MAR=5%)	11.26%	11.71%	13.22%	9.50%	7.22%
Sharpe Ratio	0.52	0.56	0.38	0.49	0.75
Sortino Ratio (MAR=5%)	0.56	0.61	0.57	0.59	0.91
Worst Drawdown	-55.55%	-58.00%	-47.80%	-49.07%	-16.42%
Worst Month Return	-22.93%	-25.16%	-20.66%	-17.82%	-12.44%
Best Month Return	12.22%	11.80%	29.60%	11.63%	8.87%
Profitable Months	66.91%	68.38%	58.58%	64.95%	72.30%



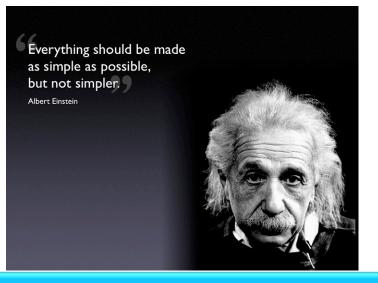
Summary Statistics: Asset Allocation with Core 5, the most recent 4 years





Are you a Story-Based Investor? $-\operatorname{Story} \Rightarrow = \left[\frac{2}{\pi}\cos(n\pi)\left[\frac{4}{n^{2}\pi^{2}} - \frac{4}{n}\right] + \frac{8}{n\pi^{2}}\sin(n\pi)\right] - \left[\frac{2}{\pi}\cos(0)\left[\frac{4}{n^{2}\pi^{2}}\right] + 0\right]$

Or are you an Empirical-Based Investor? Evidence → =1/N





Keep it Simple







APPENDIX



Statistics Descriptions

- > CAGR: Compound annual growth rate
- > Standard Deviation: Sample standard deviation
- Downside Deviation: Sample standard deviation, but only monthly observations below 41.67bps (5%/12) are included in the calculation
- > Sharpe Ratio (annualized): Average monthly return minus treasury bills divided by standard deviation
- > Sortino Ratio (annualized): Average monthly return minus treasury bills divided by downside deviation
- > Worst Drawdown: Worst peak to trough performance (measured based on monthly returns)
- > Rolling X-Year Win %: Percentage of rolling X periods that a strategy outperforms
- > Sum (5-Year Rolling MaxDD): Sum of all 5-Year rolling drawdowns
- Down %: The Down Number Ratio is a measure of the number of periods that the investment was down when the benchmark was down, divided by the number of periods that the benchmark was down. The smaller the ratio, the better
- Up %: The Up Number Ratio is a measure of the number of periods that the investment was up when the benchmark was up, divided by the number of periods that the benchmark was up. The larger the ratio, the better
- Tracking Error: Tracking Error is measured by taking the square root of the average of the squared deviations between the investment's returns and the benchmark's returns
- > Negative Correlation: Correlation of returns relative to benchmark returns when the benchmark is negative
- > Positive Correlation: Correlation of returns relative to benchmark returns when the benchmark is positive



Disclosures

Performance figures contained herein are hypothetical, unaudited and prepared by Alpha Architect, LLC; hypothetical results are intended for illustrative purposes only.

Past performance is not indicative of future results, which may vary.

There is a risk of substantial loss associated with trading commodities, futures, options and other financial instruments. Before trading, investors should carefully consider their financial position and risk tolerance to determine if the proposed trading style is appropriate. Investors should realize that when trading futures, commodities and/or granting/writing options one could lose the full balance of their account. It is also possible to lose more than the initial deposit when trading futures and/or granting/writing options. All funds committed to such a trading strategy should be purely risk capital.

Hypothetical performance results (e.g., quantitative backtests) have many inherent limitations, some of which, but not all, are described herein. 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 adhere to a particular trading program in spite of trading losses are material points which can adversely affect actual trading results. The hypothetical performance results contained here no assurance that the 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 results, all of which can adversely affect actual trading results. Hypothetical 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 are presented for illustrative purposes only.

Indexes are unmanaged, do not reflect management or trading fees, and one cannot invest directly in an index.

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.





QUESTIONS?



Affordable Active Alpha | Built to Beat Behavioral Bias | We Empower Investors Through Education