MSCI ANNUAL CONFERENCE ON **GLOBAL INVESTING AND RISK**

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Jumeirah Carlton Tower

London, UK



DYNAMIC FACTOR ALLOCATION STRATEGIES



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INNOVATIONS IN FACTOR STRATEGIES

Research **Innovation** 2006 2017+ **Demand Factors – Key Drivers How Much Multi-Factor Dynamic Factor Allocation** of Risk/Return **Active Risk?** 'Static Combinations' **Strategies** LOW **VOLATILITY** Long / Short **Trends Top-Down HIGH YIELD Index Mix Optimized** Macro QUALITY High **Fundamentals** MOMENTUM **Exposure Bottom-Up 'Integrated** Risk Approach' Moderate Tilts (sML) SIZE



DYNAMIC FACTOR ALLOCATION STRATEGIES

GROUPING FACTORS BASED ON THEIR CHARACTERISTICS

Macro Sensitivities

- Growth
- Inflation

Trend

- Cross-sectional
- Time-series

Fundamental

- Valuations
- Cross-sectional
- Time-series

Risk

- Correlations
- Volatility



MSCI 'HIGH EXPOSURE' FACTOR INDEXES

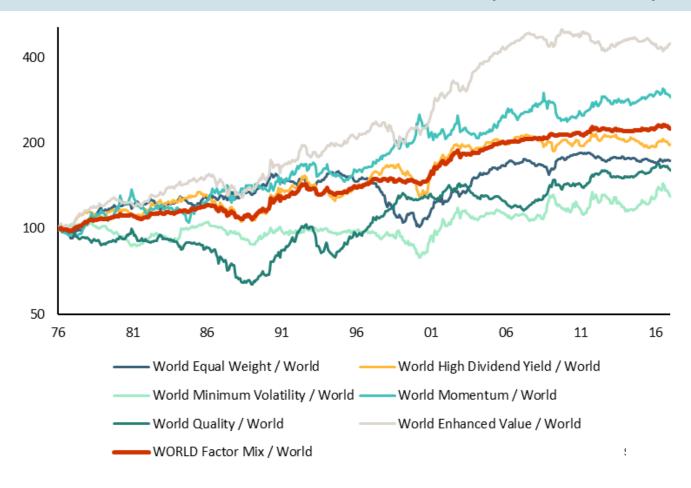
• The following MSCI World indexes are used throughout this presentation as a representation of the target factor.

Target Factor	MSCI World Factor Index		
LOW VOLATILITY	Minimum Volatility		
% HIGH YIELD	High Dividend Yield		
QUALITY	Quality		
MOMENTUM	Momentum		
VALUE	Enhanced Value		
SIZE	Equal-Weighted		



CAN WE DO BETTER THAN EQUAL-WEIGHT FACTORS?

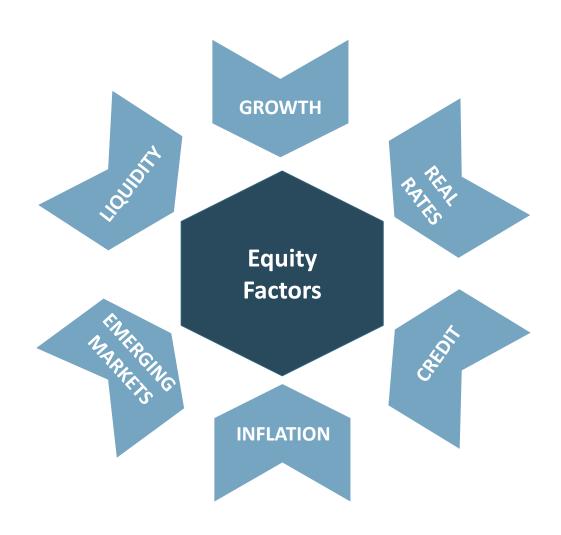
LONG TERM PERFORMANCE VS MSCI WORLD (JAN '76-Dec'16)





Source: MSCI

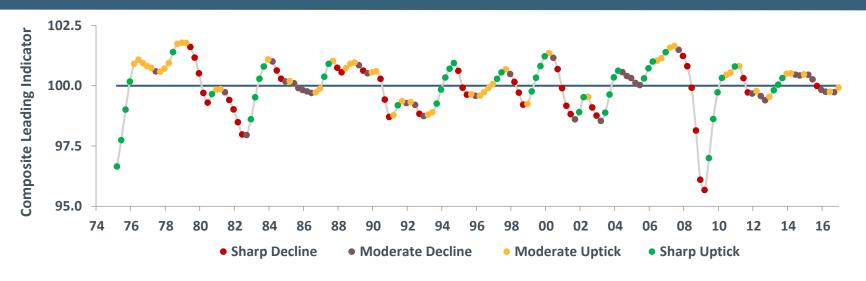
MACRO EFFECTS ON FACTOR PERFORMANCE

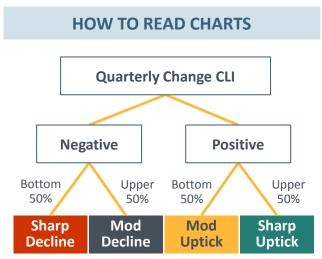


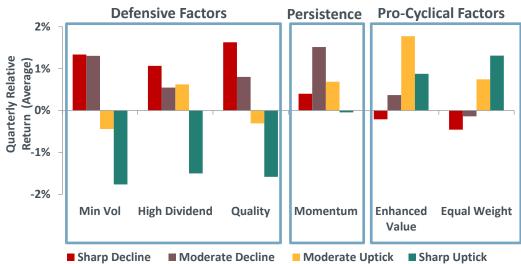


Trend

GROUPING FACTORS BY MACRO SENSITIVITY









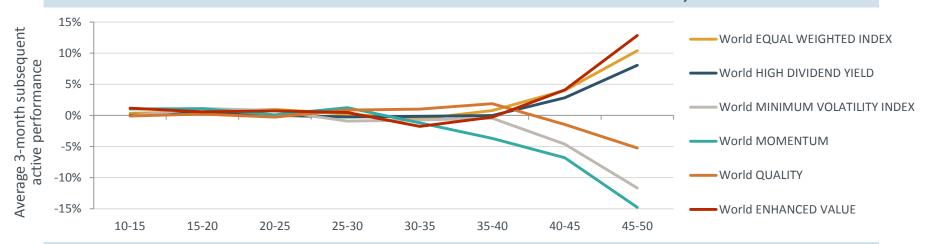
CORRELATION OF ACTIVE FACTOR RETURNS AND MACRO VARIABLES

Minimum Volatility	Equal Weighted	Enhanced Value	High Dividend Yield	Momentum	Quality	Diversified Factor Mix
-0.25	0.14	0.16	-0.04	-0.03	-0.21	-0.07
-0.07	-0.07	-0.03	-0.02	0.05	0.00	-0.03
-0.07	0.11	0.06	-0.07	0.01	-0.08	-0.01
-0.19	0.38	0.29	0.04	0.10	-0.02	0.16
0.30	-0.09	-0.10	-0.02	0.06	0.17	0.10
	-0.25 -0.07 -0.07	Volatility Weighted -0.25 0.14 -0.07 -0.07 0.11 -0.19 0.38	Volatility Weighted Value -0.25 0.14 0.16 -0.07 -0.07 -0.03 -0.07 0.11 0.06 -0.19 0.38 0.29	Volatility Equal Weighted Value Dividend Yield -0.25	Winimum Volatility Equal Weighted Ennanced Value Dividend Yield Momentum -0.25 0.14 0.16 -0.04 -0.03 -0.07 -0.07 -0.03 -0.02 0.05 -0.07 0.11 0.06 -0.07 0.01 -0.19 0.38 0.29 0.04 0.10	Volatility Equal Weighted Value Dividend Yield Momentum Quality -0.25

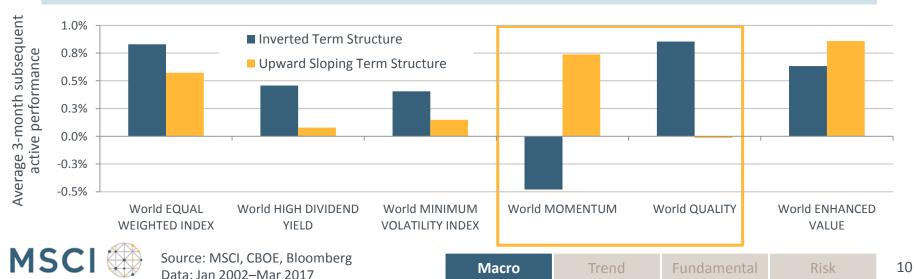


HISTORICAL FACTOR PERFORMANCE CONDITIONED ON THE VIX

HEIGHTENED LEVELS OF VIX HAVE LED TO OUTPERFORMANCE IN SIZE, VALUE AND YIELD



VIX INVERSIONS HAVE BEEN POSITIVE FOR QUALITY AND NEGATIVE FOR MOMENTUM



SHORT-TERM MOMENTUM IN FACTOR PERFORMANCE

Consider different historical look-back return windows and different strategy holding periods

Universe

6 High Exposure Factor indexes + Parent Market Cap index

Ranking

Ranking indexes based on historical performance

Strategy

Long outperformers and short underperformers, cash neutral

ANN. RETURN ON L/S MOMENTUM ON FACTORS STRATEGY

	Signal (Lookback Return)					
Holding Period	1m	3m	6m	12m	36m	60m
1m	4.9%	3.4%	3.8%	2.8%	0.6%	0.4%
3m	2.5%	2.3%	2.5%	2.2%	0.1%	0.1%
6m	1.6%	1.7%	2.0%	1.7%	-0.2%	-0.1%
12m	1.3%	1.6%	1.7%	1.0%	-0.4%	-0.1%
36m	0.3%	0.5%	0.4%	0.1%	-0.8%	0.1%
60m	0.1%	0.2%	0.1%	-0.1%	-0.1%	0.9%

1% 2.5%

Trend

Statistical significance

Fundamental

Risk

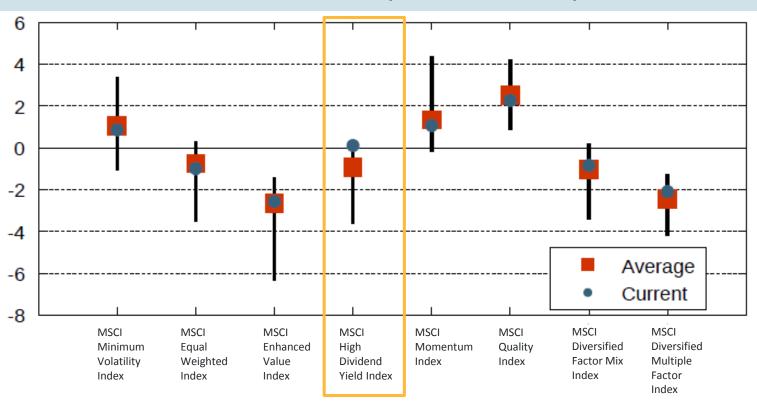
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Macro

VALUATIONS – MSCI WORLD INDEX

RELATIVE VALUATIONS (NOV '01-MAR '17)



Based on price to earnings, price to book value, price to cash earnings and price to sales at month end dates. Values below 0 indicate the factor is cheaper than the parent. A current value below average indicates that the factor is cheap relative to its own history. The line endpoints indicate historical minima and maxima.



Source: MSCI

CAN VALUATIONS BRING VALUE TO FACTOR ROTATION?

Identifying how cheap/expensive a factor index is on an absolute scale

Cross-Sectional Value Exposure

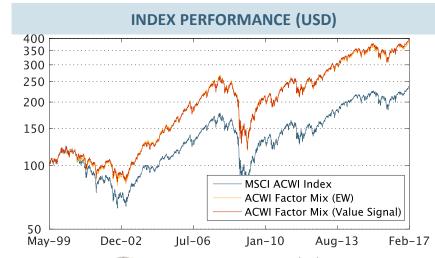
Calculate the Barra (GEMLT) value exposure of each factor index

Time-Series Value Exposure

Compare these value exposures to their historical levels

Normalize Scores and Set Weights

Normalized z-scores of all the factors (sum to 1)



Note: Factor Mix: Six high exposure factor indexes.

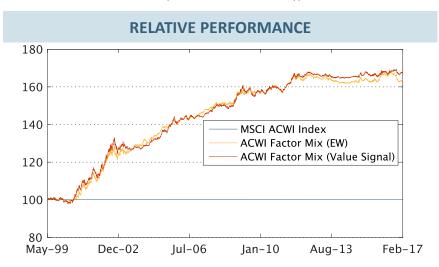
KEY METRICS

	MSCI ACWI Index		ACWI Factor Mix (Value Signal)
Total Return* (%)	5.0	7.9	8.1
Total Risk (%)	15.7	14.7	14.3
Return/Risk	0.32	0.54	0.56
Sharpe Ratio	0.18	0.40	0.42
Active Return (%)	0.0	3.0	3.1
Tracking Error (%)	0.0	2.9	3.1
Information Ratio	NaN	1.01	0.99
Turnover**(%)	3.3	32.4	42.7

Period: 31-May-1999 to 30-Dec-2016

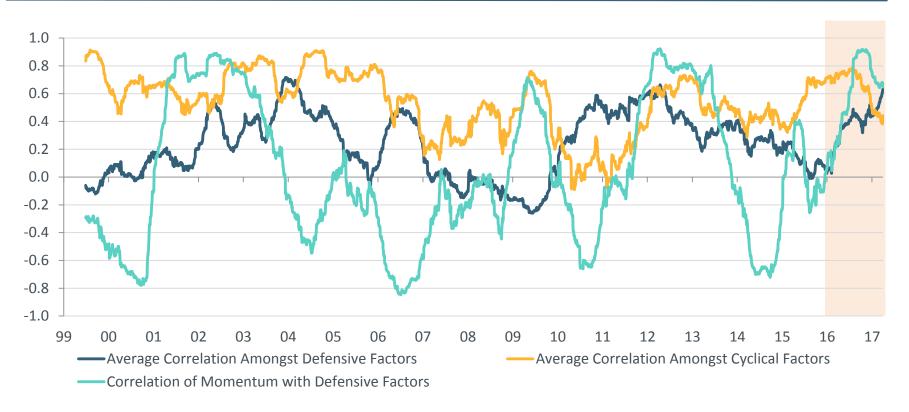
* Gross returns annualized in USD

The definitions of all statistical parameters are available in the Appendix



^{**} Annualized one-way index turnover over index reviews

FACTORING IN CORRELATIONS



- 2016 The risk-on / risk-off macro environment increased correlations within defensive and within cyclical factors to extreme levels
- 2017 YTD Some correlations are starting to fall, particularly between Momentum and Defensive factors, and Value / Size

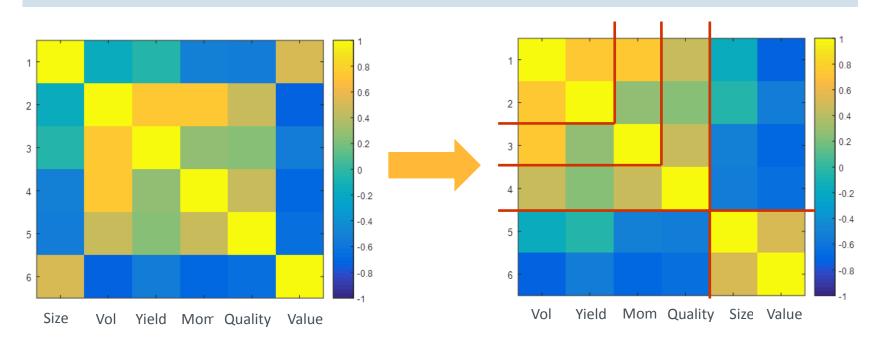


¹ Correlations are computed over rolling 6-month daily returns.

Source: MSCI

ORGANIZING CLUSTERS BASED ON CORRELATIONS

ACTIVE FACTOR RETURN CORRELATION MATRIX (JAN 2015 – SEP 2016 MONTHLY DATA)



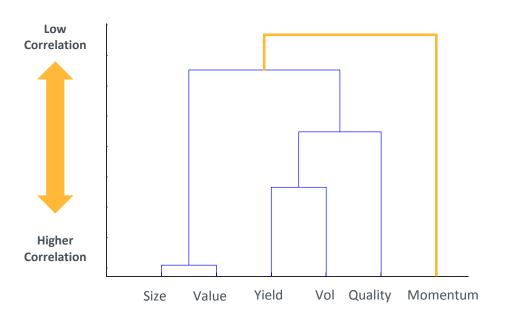
- Clustering based on correlations re-organizes the correlation matrix
- Groups assets that are broadly more correlated and move apart assets that are less correlated

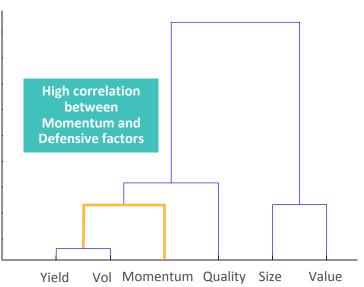


THE COMPOSITION OF CLUSTERS CAN CHANGE OVER TIME

1970-2016 MONTHLY DATA

JAN 2015-SEP 2016 MONTHLY DATA





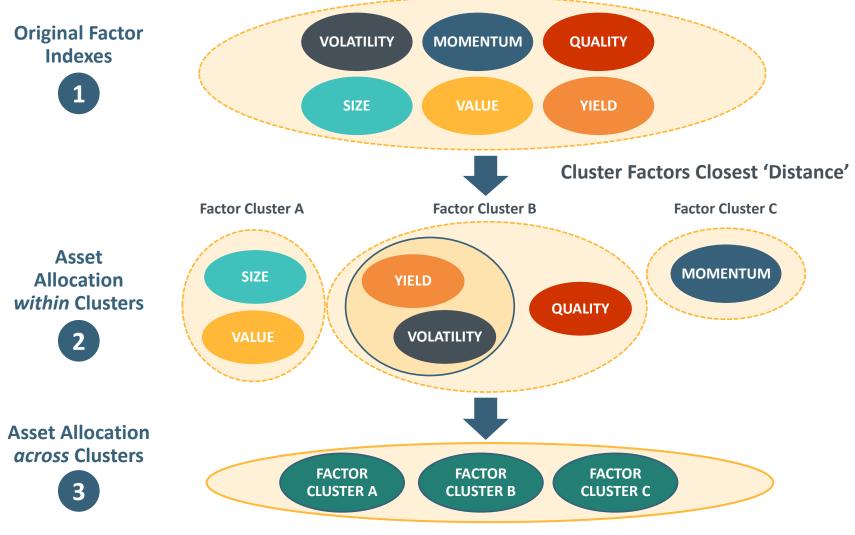
- Correlations between the active factor returns can be use to create clusters
- Allocations made across clusters (composed of factors) can potentially bring diversification benefits



Trend

Risk

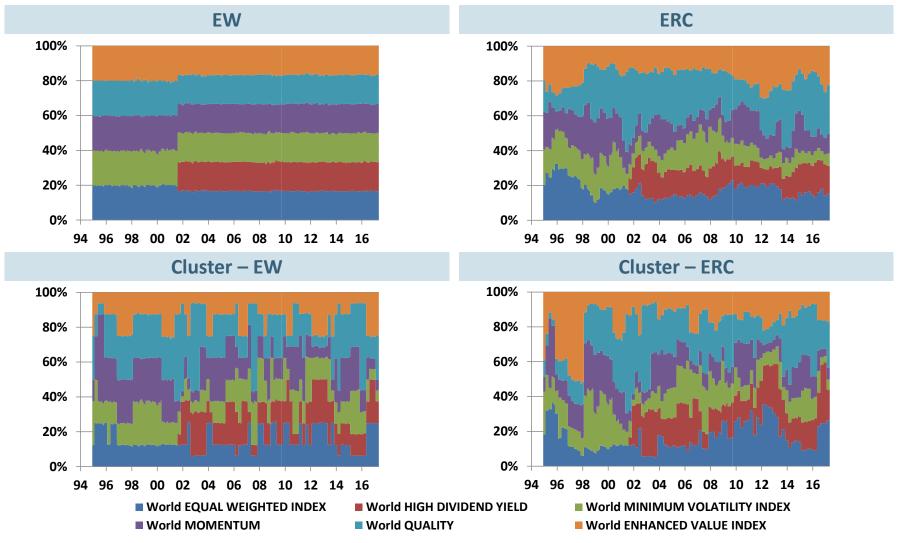
METHODOLOGY - CLUSTER BASED FACTOR ALLOCATION





Cluster Based Factor Allocation

WEIGHTS MULTI-FACTOR ALLOCATION

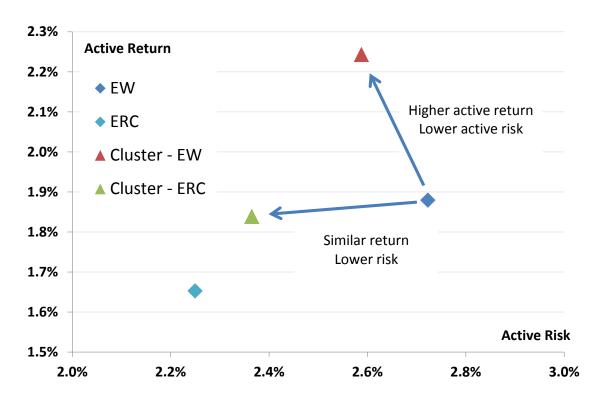




Notes: High Dividend Yield not available prior to Dec 2000. Value-weighted Index used instead of Enhanced Value prior to Dec 1997.

CLUSTER BASED FACTOR ALLOCATION – RISK/RETURN

ACTIVE RETURN VS. TRACKING RISK (1994–2017 YTD¹)



• Cluster based allocation to factors have outperformed simple diversification in terms of risk-adjusted returns relative to the benchmark index.



MULTI-FACTOR ALLOCATION

(CONSTRUCTED FROM ACTIVE RISK)



PERFORMANCE 1994–2017¹

Metrics	MSCI World	EW	ERC	Cluster - EW	Cluster - ERC
Total Return (Ann.)	8.23%	10.11%	9.89%	10.48%	10.07%
Volatility (Ann.)	15.23%	13.84%	14.17%	14.11%	14.15%
Sharpe Ratio	0.54	0.73	0.70	0.74	0.71
Active Return (Ann.)		1.88%	1.65%	2.24%	1.84%
Active Risk (Ann.)		2.72%	2.25%	2.59%	2.36%
Information Ratio		0.69	0.73	0.87	0.78



Notes: Correlations computed over trailing 6-months. High Dividend Yield not available prior to Dec 2000.

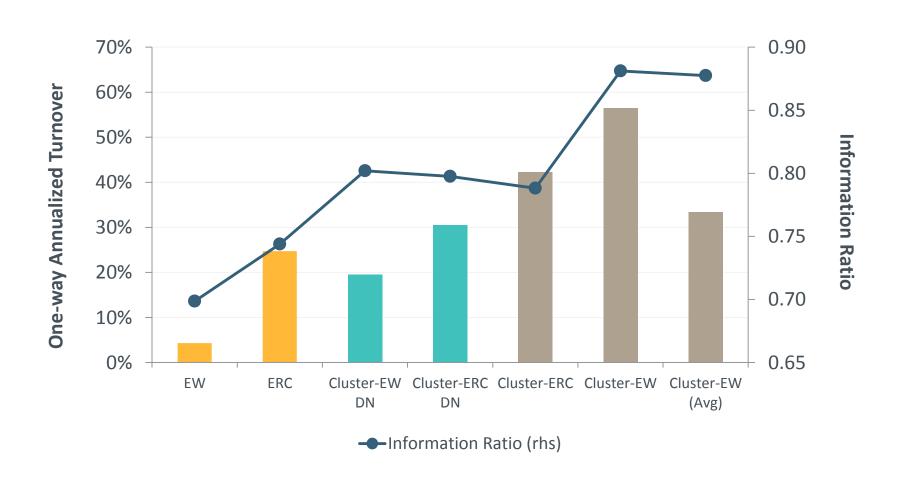
Value-weighted Index used instead of

Enhanced Value prior to Dec 1997.

1. Data: 1st June 1994–1st May 2017



ANNUALIZED ONE-WAY TURNOVER (INDEX LEVEL)





DYNAMIC FACTOR ALLOCATION STRATEGIES

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- Cross-sectional
- Time-series

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- Time-series

Risk

- Correlations
- Volatility



APPENDIX



DIFFERENT APPROACHES TO BUILDING CLUSTERS

FIXED NUMBER OF CLUSTERS (e.g., 2 CLUSTERS)

DYNAMIC NUMBER (DN) OF CLUSTERS

N - 1 CLUSTERS

MERGE CLUSTERS

Example

- Cluster A: Value, Size, Yield, Volatility, Quality
- Cluster B: Momentum
- A + B = Factor Mix

MERGE SIMILAR CLUSTERS

Example

- Cluster A: Value, Size
- Cluster B: Yield, Volatility
- Cluster C: Quality
- Cluster D: Momentum
- Cluster BC: Yield, Volatility, Quality
- A + BC + D = Factor Mix

BINARY COMBINATION CLUSTERS

Example

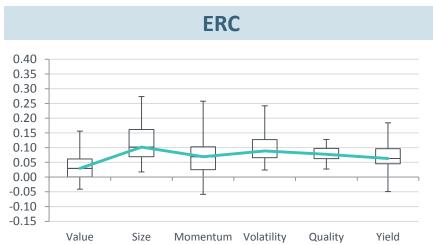
- Cluster A: Value, Size
- Cluster B: Yield, Volatility
- Cluster C: Quality
- Cluster D: Momentum
- Cluster E: B + C
- Cluster F: A + F
- F + F = Factor Mix

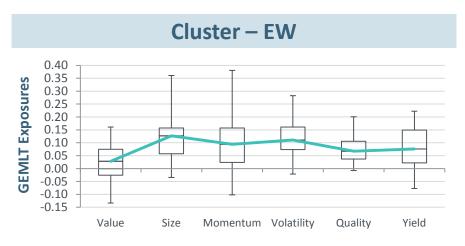


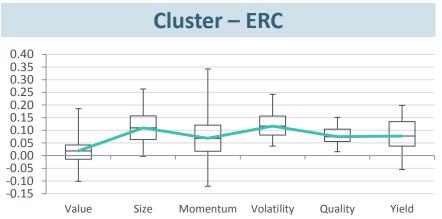
Trend

EXPOSURES MULTI-FACTOR ALLOCATION





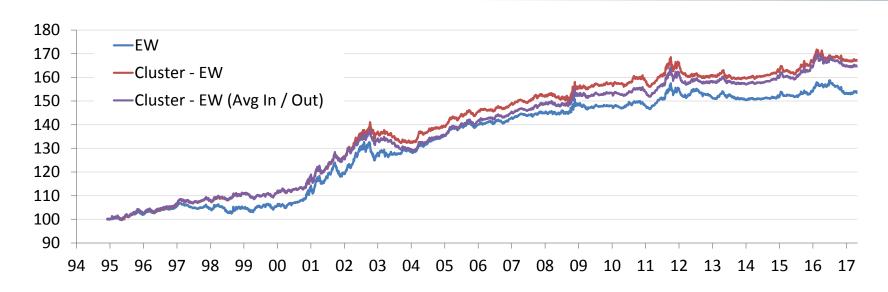






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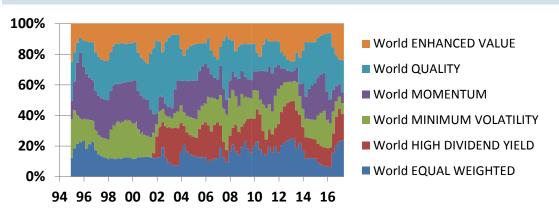
AVERAGING WEIGHTS IN AND OUT



PERFORMANCE 1994–2017¹

Metrics	Cluster – EW	Cluster – EW (Avg. In/Out)
Total Return (Ann.)	10.48%	10.41%
Volatility (Ann.)	14.11%	14.05%
Sharpe Ratio	0.74	0.74
Active Return (Ann.)	2.24%	2.18%
Active Risk (Ann.)	2.59%	2.53%
Information Ratio	0.87	0.86

CLUSTER – EW (AVERAGING WEIGHTS IN AND OUT)





Notes: High Dividend Yield not available prior to Dec 2000. Value-weighted Index used instead of Enhanced Value prior to Dec 1997.

QUARTERLY AND ANNUAL ACTIVE RETURNS

CLUSTER EW (AVERAGE IN / OUT)

EQUAL-WEIGHT

CLUSTER VS. EW

	Q1	Q2	Q3	Q4	Annual
1995	0.7%	1.5%	0.5%	0.0%	2.7%
1996	0.8%	1.0%	0.5%	1.5%	3.9%
1997	0.8%	-0.6%	1.0%	0.3%	1.5%
1998	1.5%	-1.4%	1.8%	0.6%	2.5%
1999	-1.4%	0.4%	0.5%	1.1%	0.5%
2000	-0.1%	1.0%	0.5%	4.7%	6.1%
2001	3.0%	0.1%	3.8%	-0.7%	6.3%
2002	2.8%	3.5%	2.2%	-1.9%	6.6%
2003	0.0%	-1.4%	-1.1%	-0.9%	-3.4%
2004	2.3%	0.4%	1.3%	0.4%	4.6%
2005	2.6%	0.9%	1.1%	-0.3%	4.4%
2006	0.6%	0.4%	0.2%	1.5%	2.6%
2007	1.0%	-0.3%	1.1%	0.5%	2.2%
2008	0.4%	-0.1%	-0.3%	2.9%	2.9%
2009	-0.5%	0.6%	-0.1%	0.3%	0.4%
2010	-0.4%	0.7%	1.0%	-1.0%	0.3%
2011	-0.2%	1.8%	4.6%	-1.0%	5.2%
2012	-2.9%	1.1%	-0.8%	0.3%	-2.4%
2013	0.7%	-0.4%	-0.5%	-0.4%	-0.7%
2014	0.4%	0.1%	0.6%	0.8%	1.9%
2015	0.4%	-0.5%	2.6%	0.4%	2.8%
2016	2.1%	0.0%	-0.6%	-1.1%	0.3%
2017	-0.1%				-0.3%

Q1	Q2	Q3	Q4	Annual
0.3%	1.8%	0.1%	0.0%	2.2%
0.7%	0.9%	0.4%	1.4%	3.4%
0.5%	-1.3%	0.3%	-0.3%	-0.9%
1.4%	-2.8%	0.7%	0.9%	0.2%
-1.2%	1.5%	0.8%	-0.2%	0.9%
-0.9%	2.0%	1.2%	5.1%	7.5%
3.3%	0.3%	3.9%	-2.2%	5.3%
2.9%	5.2%	2.3%	-3.4%	7.0%
0.0%	-0.1%	1.2%	-0.5%	0.6%
2.1%	0.5%	1.6%	0.8%	5.1%
2.2%	0.9%	0.8%	-0.5%	3.4%
0.6%	0.2%	-0.2%	1.5%	2.1%
0.9%	-0.2%	0.4%	0.2%	1.4%
0.2%	0.5%	-0.7%	2.5%	2.6%
-1.0%	0.5%	0.1%	0.0%	-0.5%
-0.5%	1.4%	0.4%	-1.2%	0.0%
0.1%	1.8%	4.0%	-1.0%	4.9%
-2.1%	1.6%	-0.9%	-1.1%	-2.5%
1.2%	-0.3%	-0.8%	-0.7%	-0.7%
0.4%	0.1%	0.1%	0.4%	1.0%
0.5%	-0.4%	1.3%	0.1%	1.6%
1.6%	0.9%	-1.3%	-1.7%	-0.5%
0.1%				-0.1%

Outperformance				
Annual				
0.5%				
0.5%				
2.3%				
2.4%				
-0.4%				
-1.4%				
1.0%				
-0.4%				
-3.9%				
-0.5%				
1.0%				
0.5%				
0.9%				
0.3%				
0.8%				
0.3%				
0.4%				
0.1%				
0.0%				
0.9%				
1.2%				
0.8%				
-0.2%				

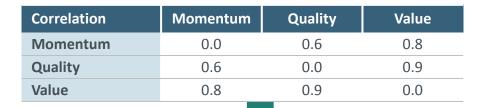


HOW ARE CLUSTERS FORMED?

Correlation	Momentum	Quality	Value
Momentum	1.0	0.2	-0.1
Quality	0.2	1.0	-0.5
Value	-0.1	-0.5	1.0

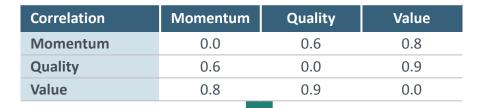


 Measure of directional co-movement





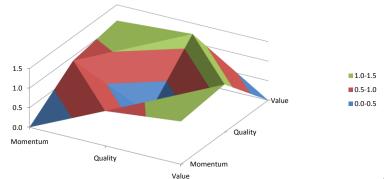
 SQRT[(1 – CORR)/2] between 0 (close) and 1 (far)



Euclidean Distance (from all pairs)

• SQRT[SUM [F(i,j) – F(k,j)]^2]







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- Building Diversified Portfolios that Outperform Out-of-Sample,
 Marcos Lopez de Prado, May 23, 2016 (*Journal of Portfolio Management*, 2016, Forthcoming)
- Quantum-ready hierarchical risk parity, Alipour et al, 1QB IT, Nov 14, 2016.



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