Kellogg-Morgan Stanley Sustainable Investing Challenge



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WHAT IS ENVEST?

- Envest is a unique thematic index, integrated with a smart beta strategy
- Envest directs assets exclusively to the environmental theme with the long term aim of reducing the inherent risk caused due to climatic factors.



ENVEST INDEX (USD)





Value score methodology

- Forward P/E, P/B, EV/CFO (in case of non-financials)
- Taking inverse of each ratio
- Winsorize each variable (remove outliers)
- Normalize the series (z-score)
- Create composite z-score
- Create sector relative z-score
- Create standard V-score for each security

Data Source: Bloomberg



Fields identifying climate exposure

- Total **Greenhouse Gas** emissions measured in millions of metric tons (ex CO2)
- Total CO2 emissions measured in thousands of metric tons, it includes both direct and indirect emissions.
- **Total waste** measured in tons, depicts the waste that the company discards.
- Total amount of water used, measured in thousands of cubic meters; measures the total supply of water for its operational purpose including process and cleaning water including water retained through recycling.
- Total energy consumption measured in Mega Watt hour, includes energy directly consumed through combustion and chemical production in known equipment and in a controlled environment respectively.

Data Source: Bloomberg



Climate score

- Identified emission values for each security beginning 2011
- Estimated data points backwards, for companies which started reporting values only during recent times
- Used industry averages (emissions/sales) to estimate missing values
- Standardized each series by using Market capitalization
- Normalized each series (z-score)
- Created a weighted average zscore to form the climate score



EWMA method for portfolio risk

- Used monthly returns for 3 years, as the basis for forward looking active risk model
- Implemented Exponentially Weighted Moving Average method to model next quarter tracking error
- Used 0.97 as the half-life parameter(lambda) for EWMA
- Used the estimated variancecovariance matrix as the basis for tracking error.

Data source: Bloomberg



Climate factor reduction from S&P

- The total sum of product of each security's weights in S&P 500 with their respective climate score, gives climate score for S&P
- Similarly, the total sum of product of each security's weights in portfolio with their respective climate score, gives climate score for the portfolio
- Created a function which identifies percentage reduction of portfolio climate score from the S&P 500 climate score
- Optimized the portfolio beginning 2011 since emission data was available from that year onwards on public domain.

PORTFOLIO OPTIMIZATION OBJECTIVES

TRACKING ERROR

- The portfolio should be very close to the benchmark, while weeding out the exposure to climate factors
- Objective is set to minimize the forward looking tracking error (active risk)
- Tracking Error is estimated using Exponential Weighted Moving Average method
- Used monthly returns for past 3 years.
- This model gives higher weightage to most recent values in estimating forward looking active risk.

MAXIMIZE

REDUCTION IN CLIMATE EXPOSURE FROM S&P

- The objective is to achieve maximum reduction in climate exposure from the benchmark, while being able to mimic the same levels of returns and risk profiles.
- Optimization
 Technique: Quadratic
 Convex Optimization

• 1 − w(p).C / w(b).C

Metric to measure reduction

- C is the vector for climate scores of all securities in S&P
- This measures the percentage reduction in our final portfolio, relative to the benchmark, which we want to maximize.
- Rebalancing
 Frequency: Quarterly

MINIMIZE

Metric to measure active risk

Sector level weights

Deviation of each GICS identified sector should be within +/- 2% from it's corresponding sector weight in the S&P 500

Deviation of energy sector allocation should be within +/- 4% from the benchmark

(since Energy stocks have higher values, we have relaxed the constraints)

Turnover

Maximum turnover for each quarterly rebalance capped at 40%

Portfolio Turnover

Security level weights

Weight of each security in the final portfolio should be less than 20 times its corresponding weight in the S&P 500

Value Score

Value exposure of the portfolio should be greater than 20% of the corresponding value in the S&P.

Enhanced Value Tilt

Active weights of securities

Active Sector Weights

FUND PERFORMANCE

Year	Envest	S&P
2011	5.71%	8.01%
2012	17.23%	15.38%
2013	25.81%	22.12%
2014	18.26%	12.43%
2015	-1.18%	2.61%
2016	15.94%	16.60%
2017	18.77%	14.45%



INDEX PERFORMANCE — NET RETURNS

			ANNOALIZED				
	1 Mo	3 Mo	1 Yr	3 Yr	5 Yr	10 Yr	
Envest	-0.57%	0.00%	18.77%	10.81%	15.15%	N/A	
S&P 500	-2.55%	-0.75%	14.45%	11.04%	13.46%	N/A	

INDEX RISK AND RETURN CHARACTERISTICS

				ANNUALIZED STD DEV (%)		SHARPE RATIO			MAXIMUM DRAWDOWN	
	Beta	Tracking Error	Turnover	3 yr	5 yr	10 yr	3 yr	5 yr	10 yr	2011 Q4
Envest	1.08	0.43%	40.09%	10.72%	13.96%	N/A	0.83	0.95	N/A	19.49%
S&P 500	1	0	8.61%	10.61%	12.68%	N/A	0.86	0.91	N/A	16.51%

1. 1 m LIBOR(USD) on 31st March, 2018

2. Returns annualized as of Q1 2018.

RISK AND DRAWDOWN ANALYSIS

- Active Risk Have been able to achieve a low tracking error of 0.43% historically
- Drawdown Maximum Drawdown was observed during Q4 2011. Post that period, the drawdown profile looks very similar to the benchmark.



RISK AND RETURN ATTRIBUTION



Returns from Q1 2016-Q4 2017

SECTOR ALLOCATION

- Information Technology and Financials have shown consistently higher allocations due to their low emission standards
- Real Estate, despite having emissions have been low underweighted due to underreported data

Materials, Energy and Utilities lesser allocation on have account of heavy dependency on GHG, water and energy



Sector Allocation across years

Sector/Years	2011	2012	2013	2014	2015	2016	2017	2018
Consumer Discretionary	12.49%	10.72%	14.22%	14.02%	14.77%	14.77%	14.51%	10.57%
Consumer Staples	9.41%	13.26%	12.42%	12.19%	12.28%	12.88%	11.57%	6.72%
Energy	7.93%	6.88%	6.22%	5.74%	3.35%	2.48%	2.10%	7.85%
Financials	16.13%	14.62%	16.52%	16.23%	15.82%	14.65%	16.29%	14.09%
Health Care	13.17%	13.09%	14.28%	14.85%	16.22%	15.94%	15.14%	10.86%
Industrials	9.64%	10.21%	11.14%	8.67%	7.85%	8.61%	7.76%	11.56%
Information Technology	20.82%	22.56%	20.27%	22.09%	23.46%	24.74%	26.14%	23.87%
Materials	1.60%	1.79%	1.47%	1.47%	0.95%	0.67%	0.71%	0.79%
Real Estate	3.81%	2.82%	0.38%	2.66%	2.31%	2.12%	2.99%	4.59%
Telecommunication Services	3.70%	2.34%	2.05%	1.23%	2.13%	2.08%	1.91%	3.87%
Utilities	1.26%	1.70%	1.01%	0.83%	0.84%	1.05%	0.88%	4.61%

INDEX CONSTITUENTS

INDEX CHARACTERISTICS

	Envest	S&P 500
Number of Constituents	78	505
	Weight%	
Largest	7.18	3.36
Smallest	0.028	0.02
Average	1.28	0.2
Median	0.95	0.09



2017 Q4

TOP 10 CONSTITUENTS

		Parent		Contribution to
	Index Wt(%)	Index	Sector	Portfolio Revenue
		Wt(%)		Exposure
NIKE Inc	7.18%	0.36%	Consumer Discretionary	10.67%
Adobe Systems Inc	6.20%	0.31%	Information Technology	6.01%
Charles Schwab Corp/The	4.66%	0.25%	Financials	5.90%
CME Group Inc	3.80%	0.19%	Financials	2.26%
Intuitive Surgical Inc	3.20%	0.16%	Health Care	1.47%
Analog Devices Inc	2.67%	0.13%	Information Technology	1.51%
Monster Beverage Corp	2.65%	0.14%	Consumer Staples	1.34%
VF Corp	2.11%	0.11%	Consumer Discretionary	3.85%
Edwards Lifesciences Corp	1.95%	0.10%	Health Care	0.95%
Paychex Inc	1.81%	0.09%	Information Technology	0.89%
Total	36.24%	1.84%		

As of 31st Dec, 2017

INDUSTRY ALLOCATION





Drilling down to the Industry level:-

- 1. From 2016-2017, utilities have been underweighted due to zero allocation in electric, power and multi utilities.
- 2. Beverage industry in Consumer Staples and Equipment and Supplies in Healthcare have higher allocations compared to their respective industry peers.
- 3. With regards to the Energy sector, it has been underweighted due to a dip in allocation in both oil and equipment subsectors



Energy Industry Allocation 2017 Q4



ENVEST S&P

COMPARING WITH PEER INDEXES



PEER INDEX ANALYSIS



S&P 500 index

Dow Jones Sustainability North America Composite Total Return Index

- IShares MSCI ACWI Low Carbon Target ETF
- Neuberger Berman Socially Responsive Fund
- FTSE Environmental Opportunities
- MSCI World ESG Index
- US Agg ESG Wtd Mkt Val USD
- iShares MSCI US ESG Equity



Results from the optimizer:

- 1. The optimizer has been able to achieve a reduction by the order of 30-40% in climate exposures from the S&P while maintaining a low tracking error of 0.43%.
- 2. AAA rating depicts the securities with the least climatic risks. Our portfolio allocation primarily comprises of securities with AAA and AA ratings.



Envest S&P 500

- Climate change can trigger regulatory risk as Governments prepare to deal with the potential hazards from climate change. Changes to zoning laws due to sea level rise, for example, could dramatically impact real estate prices.
- As asset prices shift with climate change, such thematic indexes and investment managers will support inclusion of companies showing good resilience towards their environmental practices.
- This will force other companies to comply their operations with sustainable practices, and thereby make the world a better place.

LIMITATIONS AND RISKS

1. Input Data

- Emission data reported by Bloomberg might not be reliable
- Real Estate and Healthcare have grossly underreported data
- Data estimation methods might not be very accurate
- No data available prior to 2011
- Stress testing portfolio against extreme events gives abnormal returns

2. Regulatory Risk

• If future regulations deem it unnecessary to report ESG metrics

3. Implementation in other markets and asset classes

- Emerging markets more data scarcity
- Commodities more challenging asset class
- Alternative investments reduced transparency contrary to the objectives

SCALABILITY



Covering a wider asset base

Diversify our fund further by adding fixed income instruments.

Expand geographically

Adding assets from universe outside the United States

Integrating smart beta strategies

Improve returns, by integrating pure factor strategies, while being consistent with thematic constraints.

Currency hedged indexes

Creating more efficient portfolios by mitigating currency risks, as we diversify our fund outside US

FUTURE SCOPE



Return/Risk attribution

Creating a more robust model, that better explains drivers of return.

Flexible evaluation

Incorporating a model by less penalizing companies which are consistently moving towards sustainability.

Impact Investing

Allowing room for investors looking to invest in green financing projects.

<u>04</u>

Industry based negative screening

Excluding companies involved in controversial weapons, tobacco, animal trafficking, etc.

MEET THE TEAM



Aishwarya Sinh



Pratul Agarwal

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Thank you!