The Alpha and Beta of ESG Investing

Amundi Quantitative Research*

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¹The opinions expressed in this presentation are those of the authors and are not meant to represent the opinions or official positions of Amundi Asset Management.

Sorted portfolio methodology North America Eurozone Summary

Sorted portfolio methodology

Sorted-portfolio approach

- Sorted-based approach of Fama-French (1992)
- At each rebalancing date t, we rank the stocks according to their Amundi **ESG** score $s_{i,t}$
- We form the five quintile portfolios Q_i for i = 1, ..., 5
- The portfolio Q_i is invested during the period]t, t+1]:
 - Q_1 corresponds to the best-in-class portfolio (best scores)
 - Q_5 corresponds to the worst-in-class portfolio (worst scores)
- Quarterly rebalancing
- Universe: MSCI World Index
- Equally-weighted and sector-neutral portfolio (and region-neutral for the global universe)

Sorted portfolio methodology North America Eurozone Summary

Sorted portfolio methodology

Table: An illustrative example

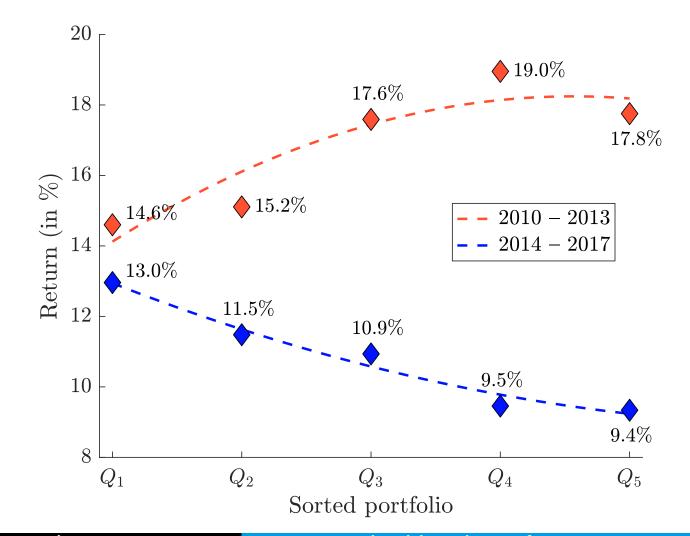
Stock	s _{i,t}	Rank	Q_i	Weight
S_1	-0.3	6	Q_3	+50%
S_2	0.2	5	Q_3	+50%
S_3	-1.0	7	Q_4	+50%
S_4	1.5	3	Q_2	+50%
S 5	-2.9	10	Q_5	+50%
S_6	0.8	4	Q_2	+50%
S_7	-1.4	8	Q_4	+50%
S ₈	2.3	2	Q_1	+50%
S ₉	2.8	1	Q_1	+50%
S ₁₀	-2.2	9	Q 5	+50%

 $\Rightarrow Q_1 = (S_8, S_9), Q_2 = (S_4, S_6), Q_3 = (S_1, S_2), Q_4 = (S_3, S_7)$ and $Q_5 = (S_5, S_{10})$

Sorted portfolio methodology North America Eurozone Summary

North America

Figure: Annualized return of ESG sorted portfolios (North America)



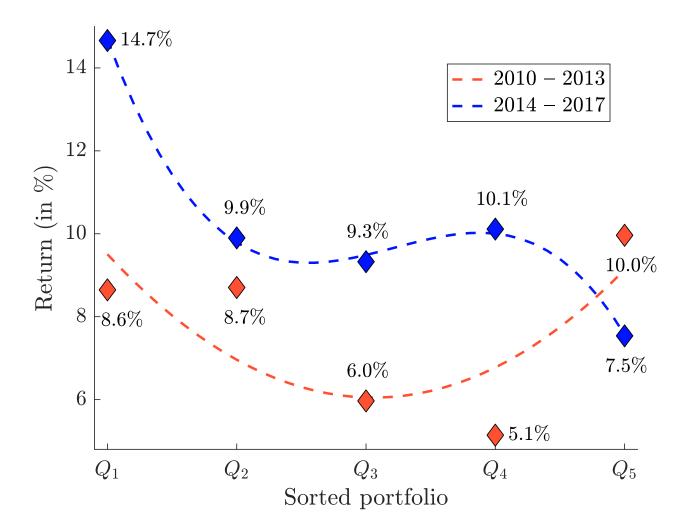
Eurozone

Figure: Annualized return of ESG sorted portfolios (Eurozone)

Sorted portfolio methodology

Eurozone

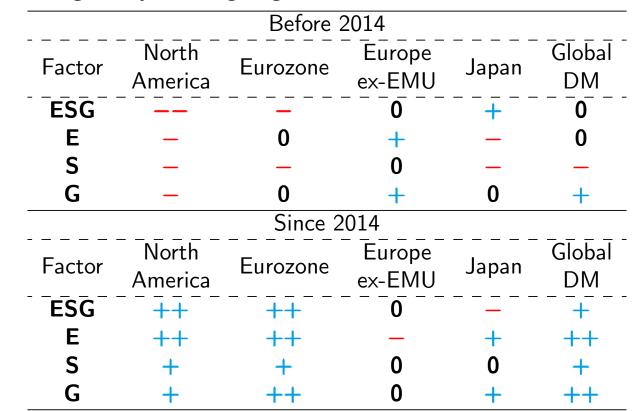
Summary



Sorted portfolio methodology North America Eurozone Summary

Summary

• ESG investing begins to be rewarded by the market, but there is a strong heterogeneity among regions:



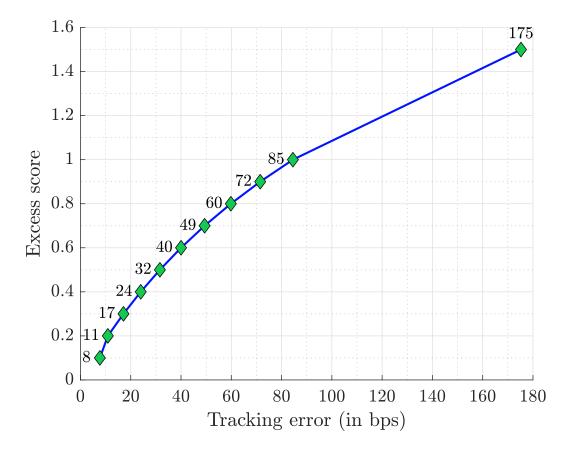
• ESG & long-term tail risk management: not yet confirmed!

S is the New Black?

The tracking-error risk of ESG investing Performance of optimized portfolios Summary

Arbitrage between ESG and TE

Figure: Efficient frontier of **ESG** optimized portfolios (Global DM)



There is no free lunch ESG investing implies to take a tracking-error risk!

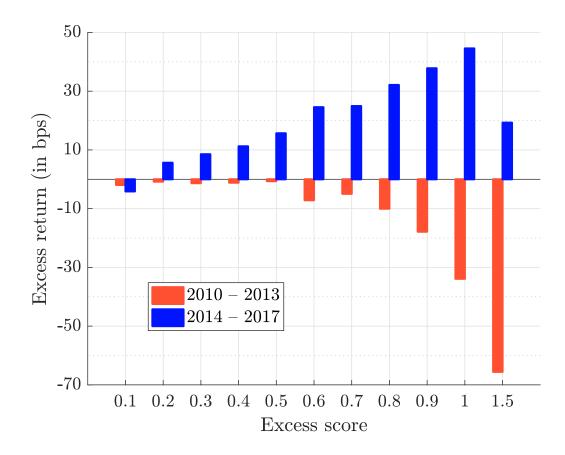
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The Alpha and Beta of ESG Investing

The tracking-error risk of ESG investing Performance of optimized portfolios Summary

Performance of optimized portfolios

Figure: Annualized excess return of **ESG** optimized portfolios (Global DM)



ESG investing & diversification: Mind the gap

Summary

The tracking-error risk of ESG investing Performance of optimized portfolios Summary

- Similar results than those obtained with ESG active management
- ESG investing requires to take tracking-error risk ⇒ Current SAA policies are not adapted
- **G** generates more tracking error than **E** and **S** ($\approx \times 1.5$)
- Impact of ESG on the diversification (stock picking \neq optimized index portfolios)

Single-factor analysis Multi-factor analysis Factor picking analysis Summary

Single-factor model

Table: Results of cross-section regressions with long-only risk factors (average R^2)

Factor	North America		Eurozone	
	2010 – 2013	2014 - 2017	2010 – 2013	2014 - 2017
Size	39.3%	23.6%	37.1%	20.9%
Value	38.9%	24.4%	41.6%	35.2%
Momentum	39.6%	23.8%	40.8%	35.8%
Low-volatility	35.8%	22.2%	38.7%	34.9%
Quality	39.1%	24.1%	42.4%	36.5%
ESG	40.1%	25.1%	42.6%	37.3%

- Specific risk has increased during the period 2014 2017
- Since 2014, we find that:
 - ESG \succ Value \succ Quality \succ Momentum \succ ... (North America)
 - ESG \succ Quality \succ Momentum \succ Value $\succ \dots$ (Eurozone)

Single-factor analysis Multi-factor analysis Factor picking analysis Summary

Multi-factor model

Table: Results of cross-section regressions with long-only risk factors (average R^2)

Factor	North America		Eurozone	
Factor	2010 - 2013	2014 - 2017	2010 – 2013	2014 - 2017
Market	40.8%	26.2%	42.8%	37.7%
5F model	46.1%	35.4%	49.5%	45.3%
6F model (5F + ESG)	46.7%	36.8%	50.1%	46.0%

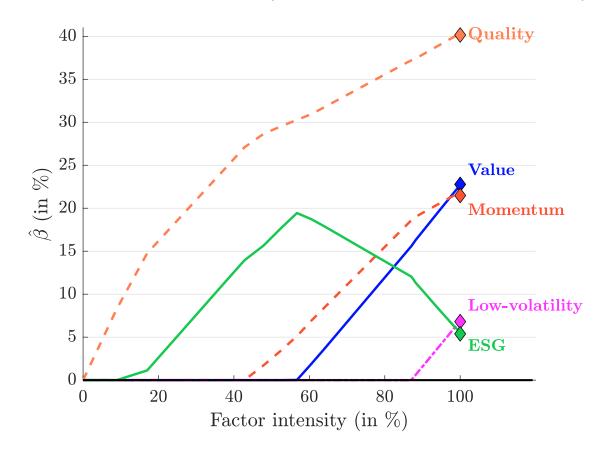
*** p-value statistic for the MSCI Index (time-series, 2014 - 2017):

- 6F = Size, Value, Momentum, Low-volatility, Quality, ESG (North America)
- 6F = Size, Value, Momentum, Low-volatility, Quality, ESG (Eurozone)

Single-factor analysis Multi-factor analysis Factor picking analysis Summary

Factor picking

Figure: Factor picking (North America, 2014 – 2017)



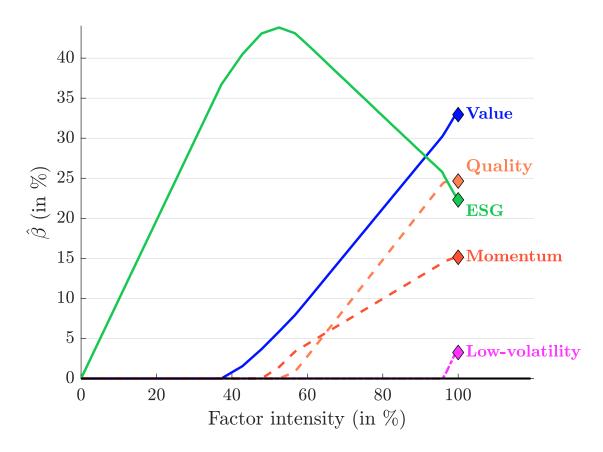
- Active management ≠ factor investing
- ESG does really matter for active management!
- The ESG-Value puzzle!

Quality \succ ESG \succ Momentum \succ Value \succ Low-volatility **BUT**...

Single-factor analysis Multi-factor analysis Factor picking analysis Summary

Factor selection

Figure: Factor picking (Eurozone, 2014 – 2017)



- Active management ≠ factor investing
- ESG does really matter for both!
- The ESG-Quality puzzle!

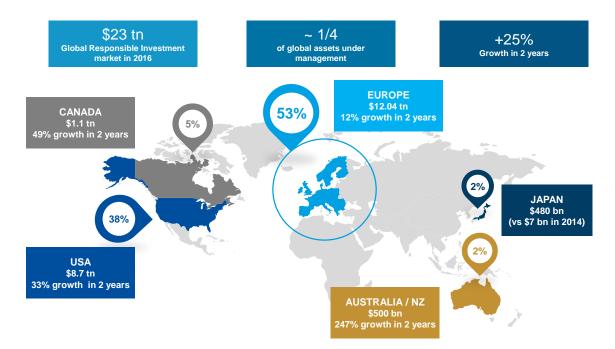
$\mathsf{ESG} \succ \mathsf{Value} \succ \mathsf{Momentum} \succ \mathsf{Quality} \succ \mathsf{Low-volatility}$ **BUT...**

Single-factor analysis Multi-factor analysis Factor picking analysis Summary

Summary

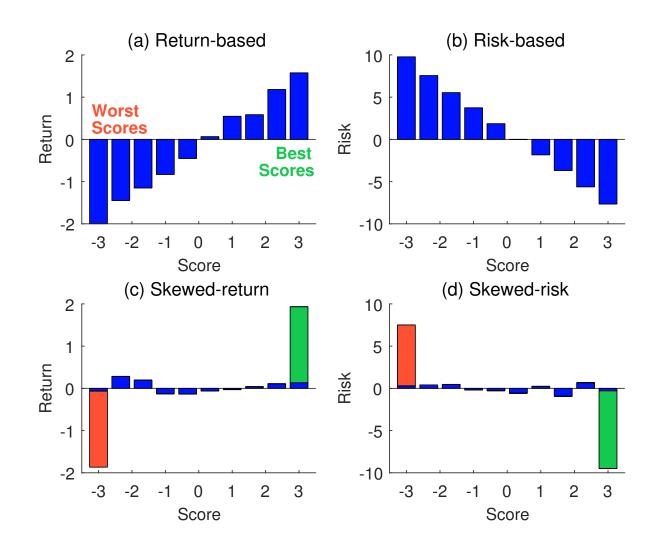
- ESG remains an alpha strategy in North America
- ESG becomes a beta strategy (= risk factor) in Europe

Figure: The market of ESG investing in 2016



Source: Global Sustainable Investment Alliance (2017).

On the optimal design of ESG investing



- Risk-based premium
- Return-based premium: ESG in North America
- Skewness-based premium: ESG and G in the Eurozone, G in North America
- Exclusion, best-in-class or full integration strategy?

Why is ESG investing different in bond markets?

- Two effects for explaining price formation process
 - Intrinsic effect (risks & return opportunities)
 - External effect (supply/demand balance)
- bonds \neq stocks
- Supply/demand imbalance \Rightarrow structure of credit spreads
- Spread correction is then essential when implementing ESG in the bond market

ESG investing and Impact investing are then more correlated in the bond market than in the stock market

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