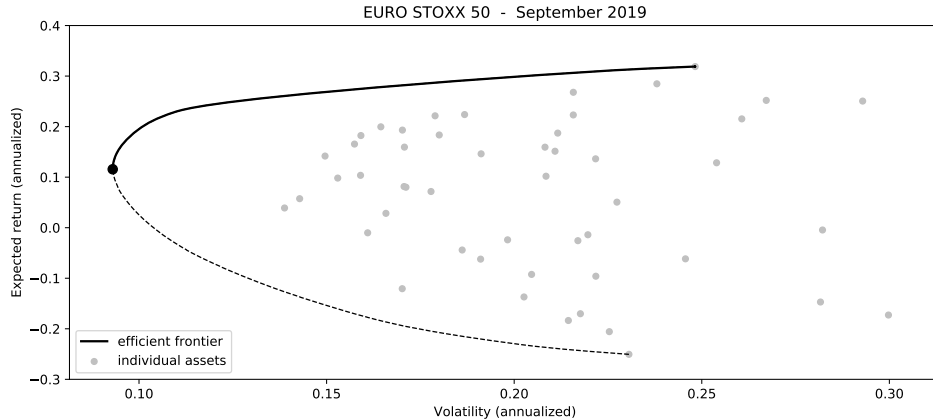


ESG: A New Dimension in Portfolio Allocation

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Joint work with Jan De Spiegeleer, Stephan Höcht,
Daniel Jakubowski and Wim Schoutens

Portfolio allocation: risk and return



The ESG dimension

- ▶ Each company can be evaluated on its environmental, social and governance (ESG) performance.
- ▶ ESG indicators:
 - ESG rating
 - Greenhouse gas emissions intensity
 - Employee turnover rate
 - ...
- ▶ 3 dimensions: risk, return and ESG performance.

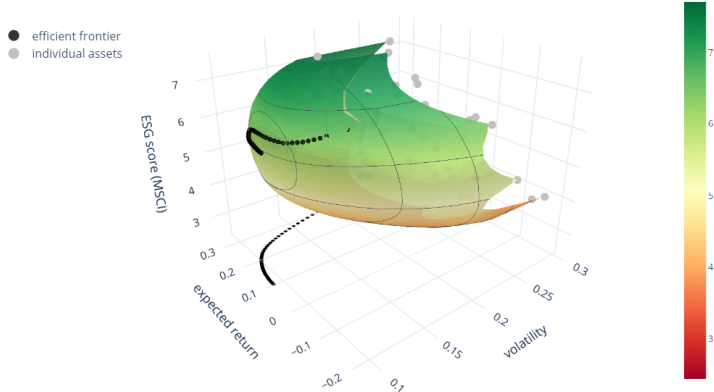
The ESG dimension

Why including ESG data?

- 1 Extra information might result in enhanced portfolio performance
- 2 Support the transition towards
 - a sustainable economy
→ UN Sustainable Development Goals
 - a low-carbon economy
→ mitigate climate change (EU Green Deal, EU climate benchmarks)

The minimum variance surface

ESG ratings example.



Portfolio ESG score = weighted average of company ESG scores.

Objective of this talk

*What is the **impact** of including environmental, social and governance (ESG) criteria in the allocation of equity portfolios?*

- ▶ Empirical analysis (2009 - 2019): STOXX Europe 600 universe
- ▶ Two sustainability measures:
 - ESG ratings
 - Greenhouse gas emission intensity

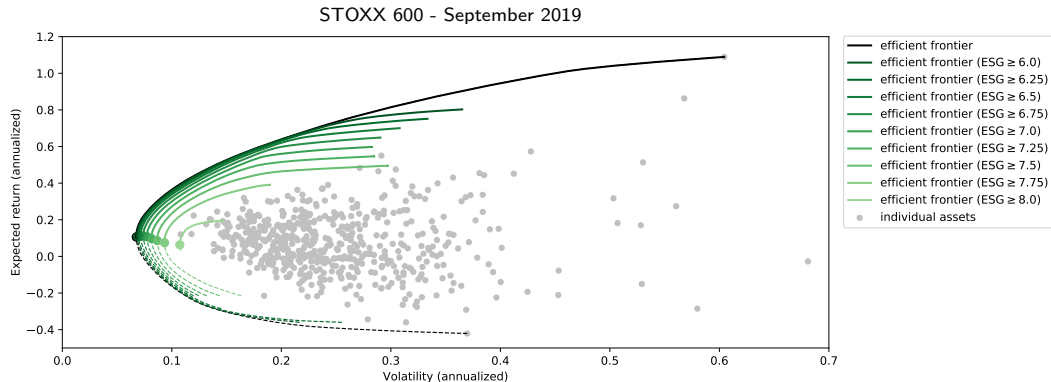
ESG rating data

ESG scores:

- ▶ weighted average key issue scores - reported by MSCI
- ▶ overall company sustainability grade between 0 (poor) and 10 (good)

Green constrained efficient frontier

- ▶ optimize risk-return trade-off, subject to ESG constraints
- ▶ green portfolio has a minimum required ESG score



ESG investment strategy

- ▶ Invest in the minimum variance portfolio satisfying ESG targets.
→ minimize risk, subject to ESG constraints

- ▶ **4 levels of greenness:**

$$\text{Dark green:} \quad \text{ESG} \geq \text{ESG}_{\text{MV}} + 20\% \cdot (\text{ESG}_{\text{max}} - \text{ESG}_{\text{min}})$$

$$\text{Green:} \quad \text{ESG} \geq \text{ESG}_{\text{MV}} + 10\% \cdot (\text{ESG}_{\text{max}} - \text{ESG}_{\text{min}})$$

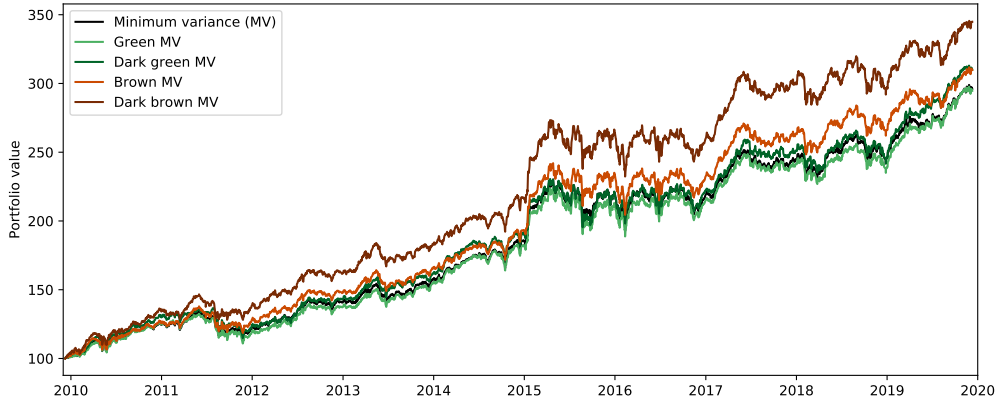
$$\text{Brown:} \quad \text{ESG} \leq \text{ESG}_{\text{MV}} - 10\% \cdot (\text{ESG}_{\text{max}} - \text{ESG}_{\text{min}})$$

$$\text{Dark brown:} \quad \text{ESG} \leq \text{ESG}_{\text{MV}} - 20\% \cdot (\text{ESG}_{\text{max}} - \text{ESG}_{\text{min}})$$

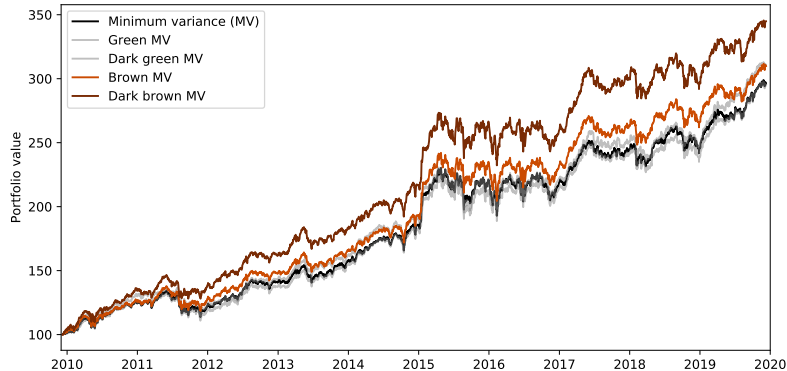
with ESG_{MV} the ESG score of the minimum variance portfolio.

Strategy performance

- ▶ quarterly portfolio rebalancing



Brown ESG strategies yield higher returns



Yearly return

MV	11.03%
Brown	11.48%
Dark brown	12.58%

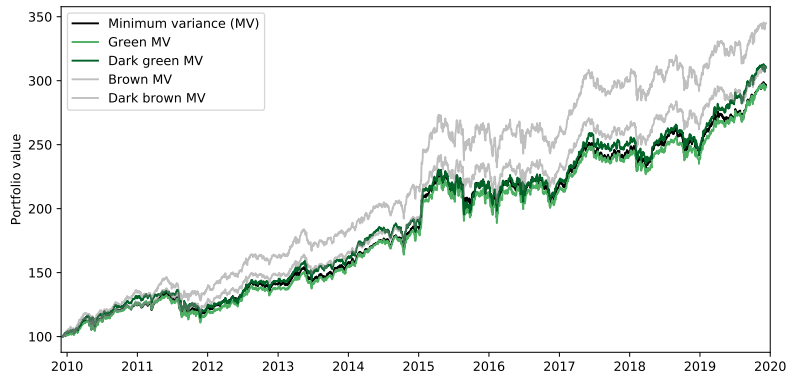
Volatility

MV	10.45%
Brown	10.56%
Dark brown	11.15%

Maximum drawdown

MV	16.29%
Brown	15.57%
Dark brown	15.04%

Green ESG constraints have little impact



Yearly return

MV	11.03%
Green	11.00%
Dark green	11.52%

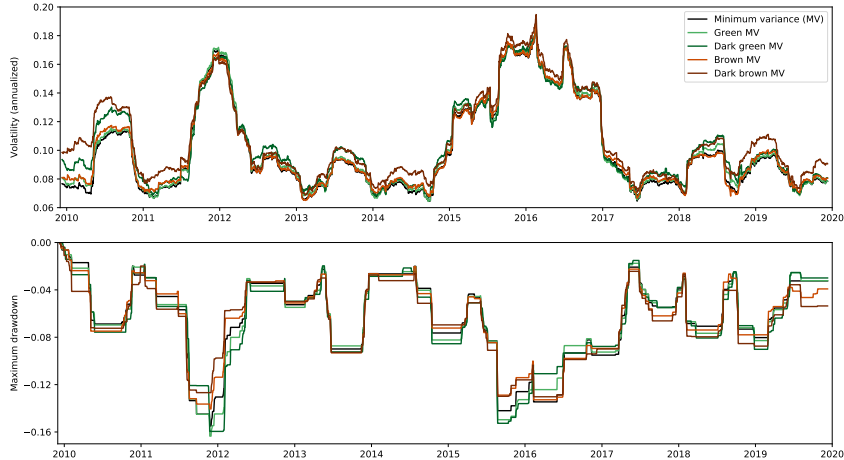
Volatility

MV	10.45%
Green	10.57%
Dark green	10.82%

Maximum drawdown

MV	16.29%
Green	16.35%
Dark green	15.95%

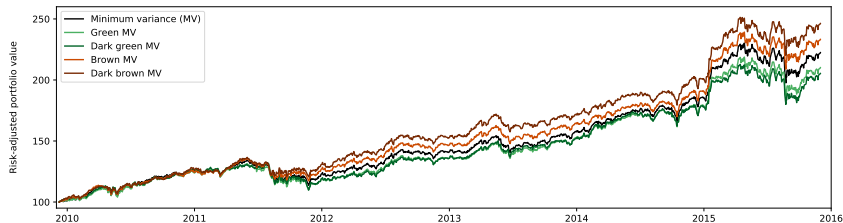
No significant difference in risk behavior



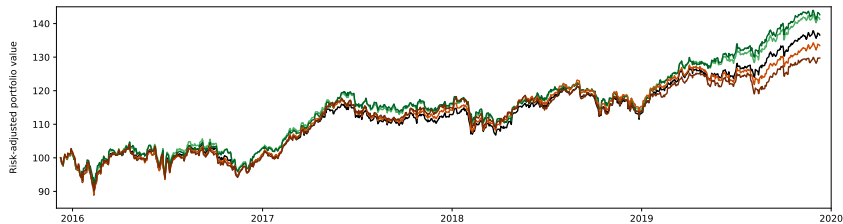
**6-months realized
volatility**

**6-months maximum
drawdown**

Comparing returns: timing is crucial



**Investment period:
Dec 2009 - Dec 2015**

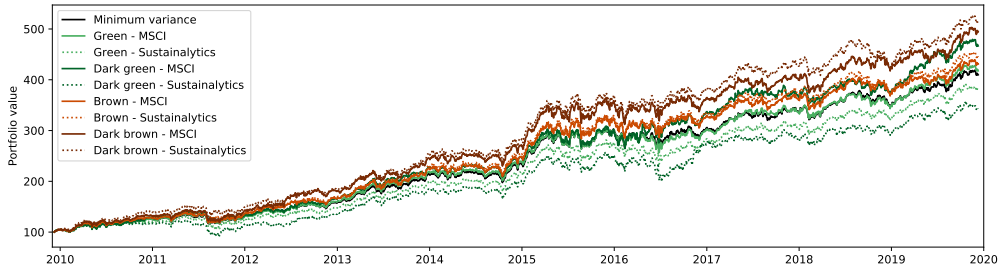


**Investment period:
Dec 2015 - Dec 2019**

Dependence on the choice of ESG rating agency?

- ▶ Rating agencies do not agree: (Berg et al., 2019), (Chatterji et al., 2016), (Dorfleitner et al., 2015), etc.
- ▶ Empirical study on the EURO STOXX 50 universe
 - **MSCI**: ESG score between 0 (poor) and 10 (good).
→ weighted average key issue scores
 - **Sustainalytics**: ESG score between 0 (poor) and 100 (good).
→ traditional ESG scores ($\neq$ ESG Risk Ratings)

Strategy performance: MSCI vs. Sustainalytics



- The impact of including Sustainalytics' ESG scores is larger - both for green and brown ESG targets.

Greenhouse gas emissions

GHG intensity

- ▶ Greenhouse gas (GHG) intensity:

$$\text{GHG intensity} = \frac{\text{tCO}_2\text{e}}{\text{MCap}}$$

- tCO₂e = scope 1 and 2 CO₂-equivalent emissions of the company (in tonnes/year)
 - MCap = the company's market capitalization (in million EUR)
-
- ▶ Why this measure?
 - Motivate companies to reduce emissions
 - TEG report on climate benchmarks

GHG investment strategy

- ▶ Invest in the minimum variance portfolio satisfying GHG targets.
→ minimize risk, subject to GHG intensity constraints

- ▶ **3 levels of greenness:**

Green:	30% GHG reduction	w.r.t. minvar portfolio
Dark green:	50% GHG reduction	
Brown:	150% GHG increase	

- ▶ TEG report on climate benchmarks:
 - Climate Transition Benchmark (CTB): 30% reduction
 - Paris-Aligned Benchmark (PAB): 50% reduction

GHG investment strategy

- ▶ Invest in the minimum variance portfolio satisfying GHG targets.

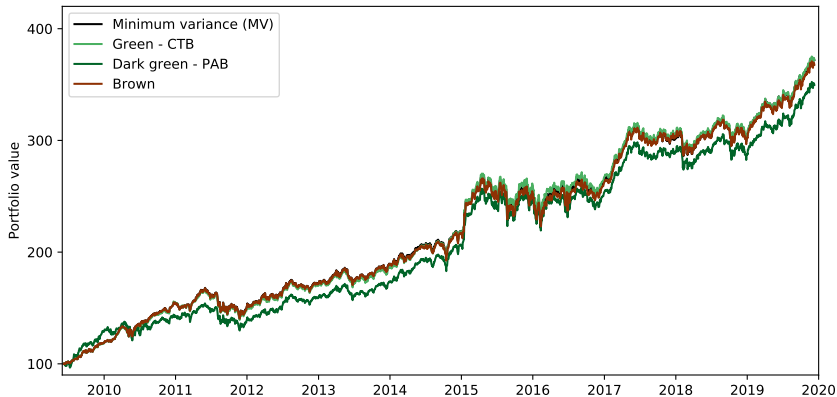
- ▶ **3 levels of greenness:**

Green:	30% GHG reduction	w.r.t. minvar portfolio
Dark green:	50% GHG reduction	
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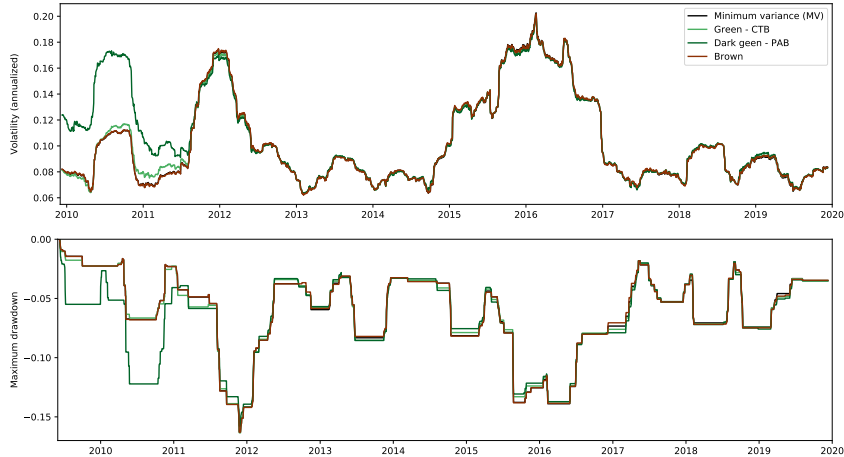
- ▶ Sector constraints:
 - Equal GICS sector exposure
 - Higher exposure to high-climate impact sectors (NACE)

Strategy performance

► Yearly rebalancing (in June)



No significant difference in risk behavior

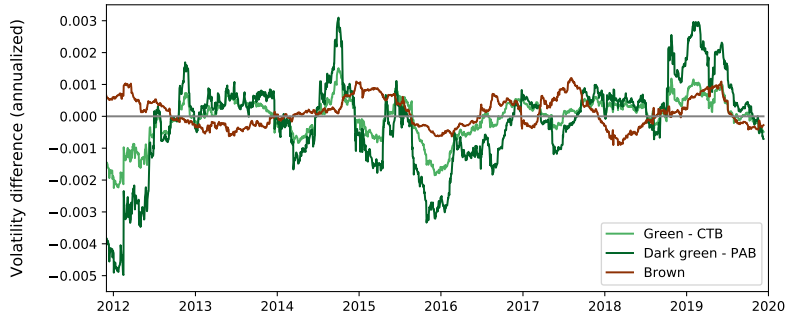


**6-months realized
volatility**

**6-months maximum
drawdown**

How large is the volatility gap exactly?

- ▶ volatility difference = $\sigma_{\text{GHG}} - \sigma_{\text{MV}}$
- ▶ negative difference: GHG strategies have lower risk



Maximum overshoot

CTB	0.15%
PAB	0.31%
Brown	0.12%

Conclusion

- ▶ Environmental, social and governance (ESG) factors: extra dimension in portfolio allocation
- ▶ ESG investment strategies - based on minimum variance portfolio
- ▶ STOXX 600 study:
 - **ESG ratings:** no clear-cut evidence for enhanced performance
 - **GHG intensity:** emission reductions do not require increased risk or diminished returns

Thank you.

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