

# The sustainability of mean-variance and mean-tracking error efficient portfolios

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*Socially responsible investing (SRI), also known as sustainable, socially conscious, green or ethical investing, is any investment strategy which seeks to consider both financial return and social good.*

- More than 12% of all professionally managed assets in the United States invested under the label of sustainable investment
- A 33 % increase in market share compared to 1995
- Quantitative approaches based on sustainability measures

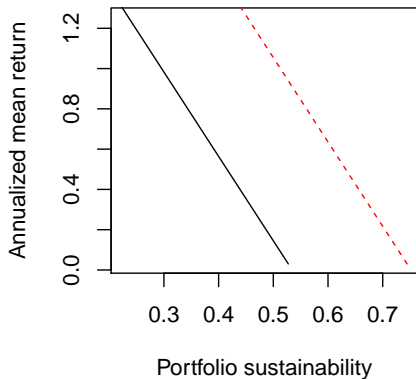
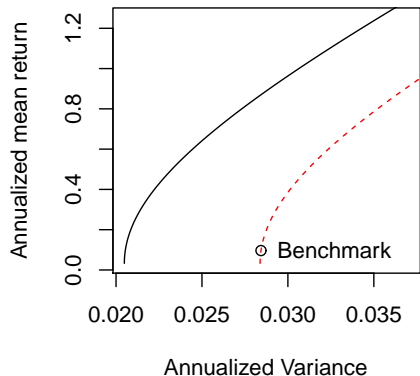
# How to measure sustainability?

- Standard approach:  
buy sustainability ratings of assets from external provider
- Data-driven approach: Eiris questionnaire with  $Q$  questions:  
*How good is company's system for implementing its code of ethics?*  
*How many stakeholder issues have been allocated to board members?*  
*How good is the company's policy on equal opportunity and diversity issues?*  
...
- Dimension reduction from these  $Q$  ratings to one sustainability rating per asset, using PCA with positive loading
- Denote  $\phi$  the vector with sustainability ratings and  $\omega$  the portfolio weights
- Portfolio sustainability is weighted average of sustainability of underlying assets:  $\omega' \phi$

# Socially Responsible Investment (SRI)

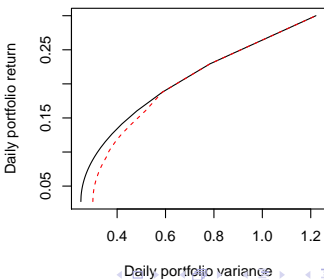
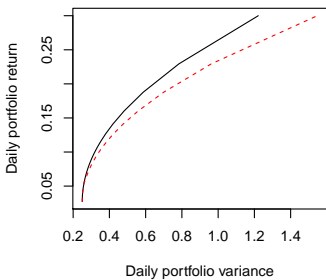
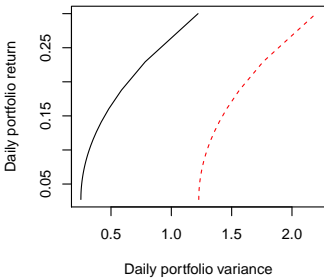
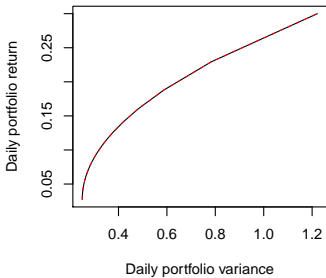
- Research question:
  - ▶ What are the financial consequences of investing ethically?
- Previous research:
  - ▶ An indirect answer: focus on empirical comparison of existing sustainable and conventional funds (e.g. Bauer et al., 2005)
  - ▶ Research assuming single stock exclusion (Galema et al. (2008) and Herzel et al. (2011))
- Our research:
  - ▶ Mean-variance and mean-tracking error efficient portfolios
  - ▶ Constraint on average portfolio sustainability instead of single stock sustainability screening

# Theoretical linear relation exists between the portfolio sustainability and the portfolio return of efficient portfolios



# Sustainability constraints for efficient mean-variance and mean-tracking error portfolios

- Suppose an investor demands portfolio sustainability above a certain threshold, i.e.  $\omega' \phi > \phi_0$
- We derive closed-form solutions for the optimal weights which are a function of: Mean return, covariance matrix and sustainability scores estimates
- Large covariance matrix estimated by shrinkage procedure from Ledoit and Wolf (2003, 2004)
- We assess the cost of the sustainability constraint for the investor:
  - ▶ Foregone portfolio return for a given risk level
  - ▶ Increased portfolio risk for a given target return



# Conclusion on the sustainability of mean-variance and mean-tracking error portfolios

- Theoretically a linear relation exists between portfolio sustainability and portfolio return
- Empirically the slope of this linear relation is rarely significantly different from zero
- Impact of sustainability restriction on portfolio performance economically relatively small



# References

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