

# Green Miracle

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## Portfolio Optimization Strategies Through Sustainability Alignment

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# OUR QUESTION

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*How Do ESG Metrics Impact Portfolio Selection and Performance?*



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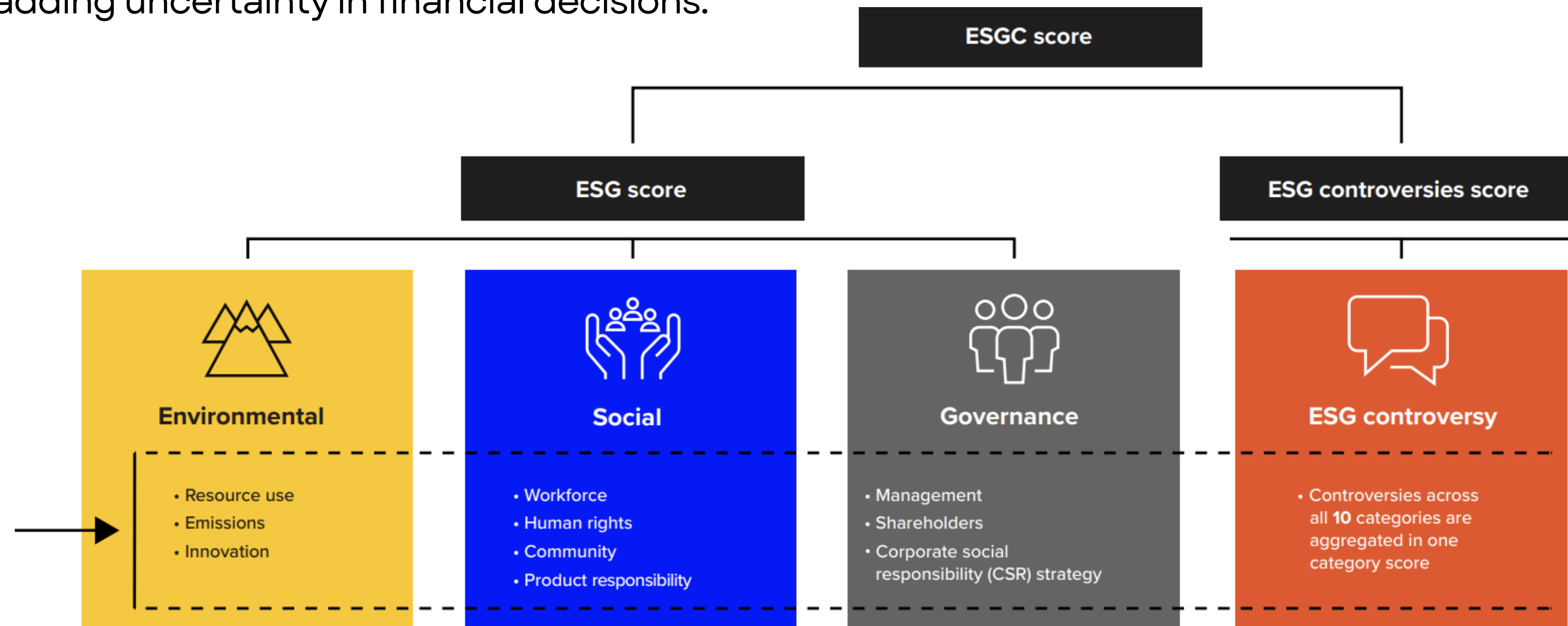
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## CONCLUSION

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# Understanding ESG Scores

- Refinitiv scores measure a company's relative ESG performance, commitment and effectiveness across ten main themes based on publicly-reported data.
- ESG rating agencies have grown into significant market shapers but the different ratings often vary, adding uncertainty in financial decisions.



# ESG FALLACIES

**01**

Lack of comparability for firms across different sectors

**02**

Discordance among scores of different rating agencies for the same company

**03**

Tendency to be rewritten ex-post

**04**

Unclear regulatory framework

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# Preparing the data & handling missing values

## **Weekly prices for 150 large European companies**

- We disregard stocks that started trading after 2010, for better comparison.

## **Yearly ESG scores**

- We set any missing initial values to 0 (worst score) and re-use the last rating if we have missing information for years in between (assuming their ESG rating does not change).
- Our dataset of 150 large European companies is only a subset of the ESG dataset based on 12,500 global public and private companies.
- Any missing values set to the worst value across companies for every year.

## **Yearly Alternative metrics**

- CO2-equivalent Emissions Indirect Scope 3 (tons) per Revenue (USD millions)
- Any missing values set to the worst value across companies for every year.

# Portfolio Construction

## PURE FINANCIAL

$$\underset{w}{\operatorname{argmin}} \quad w^T \Sigma w$$

subject to  $w^T \beta \geq 1$

- No short-selling
- Maximum weight: 5%

## ESG SCORE

Additional constraint:

$$w^T \text{ESG} \geq Q_3(\text{ESG})$$

## EMISSIONS PER REVENUE

Additional constraint:

$$w^T (-\text{CO}_2 \text{ per \$}) \geq Q_3(-\text{CO}_2 \text{ per \$})$$

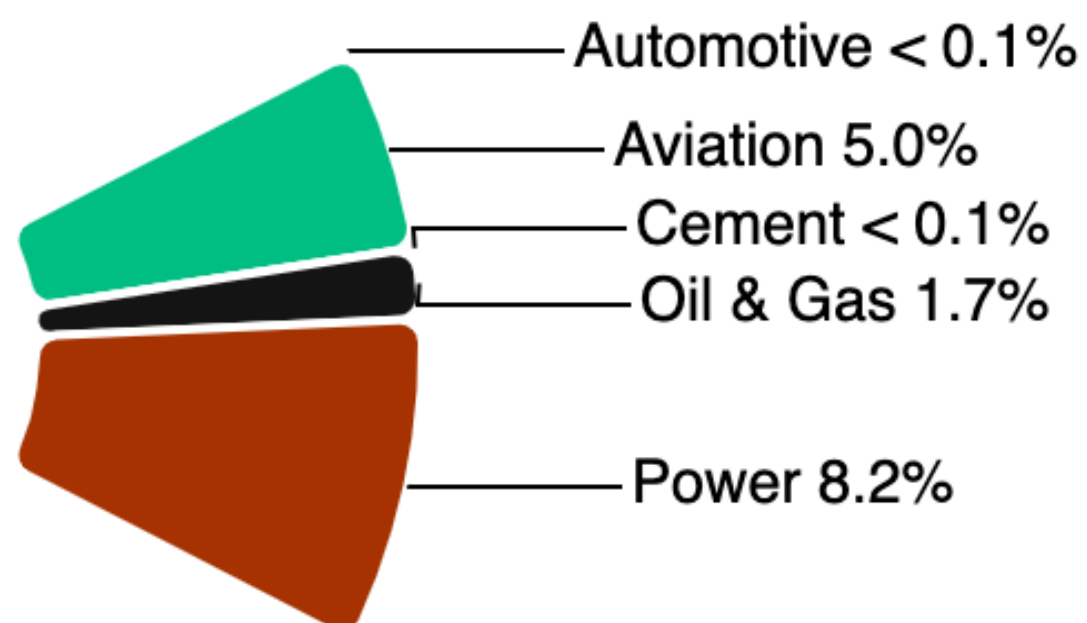


# Pacta Analysis

Portfolios are determined at the end of 2023

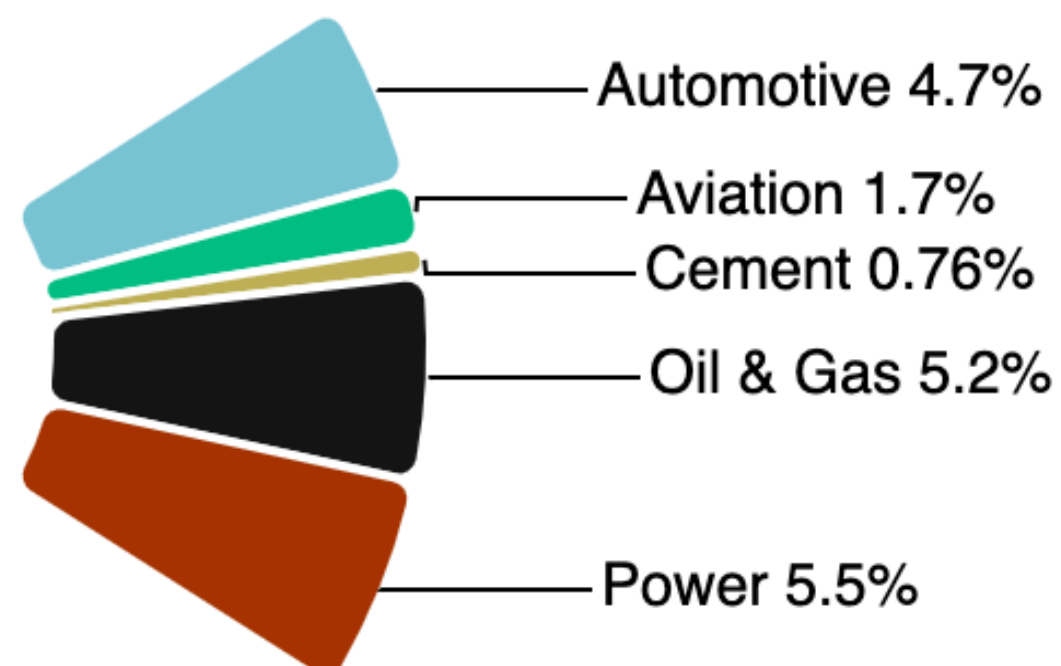
## Financial exposure from climate-relevant sectors

Pure Financial



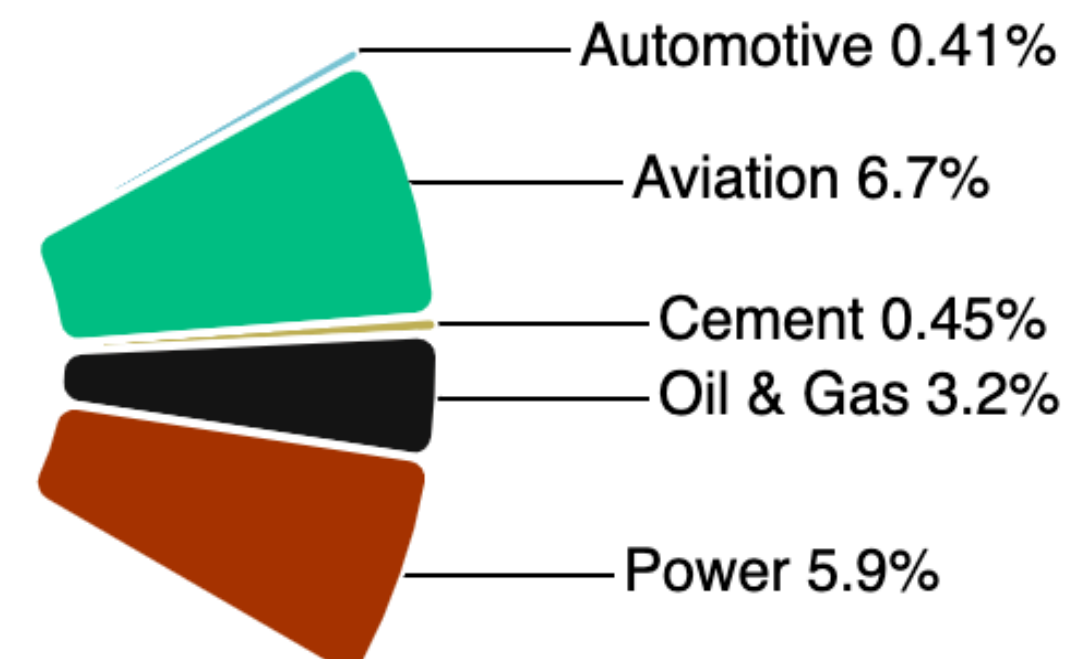
**15% of the Equity portfolio covered by PACTA**

ESG Score



**18% of the Equity portfolio covered by PACTA**

Emissions per Revenue



**17% of the Equity portfolio covered by PACTA**

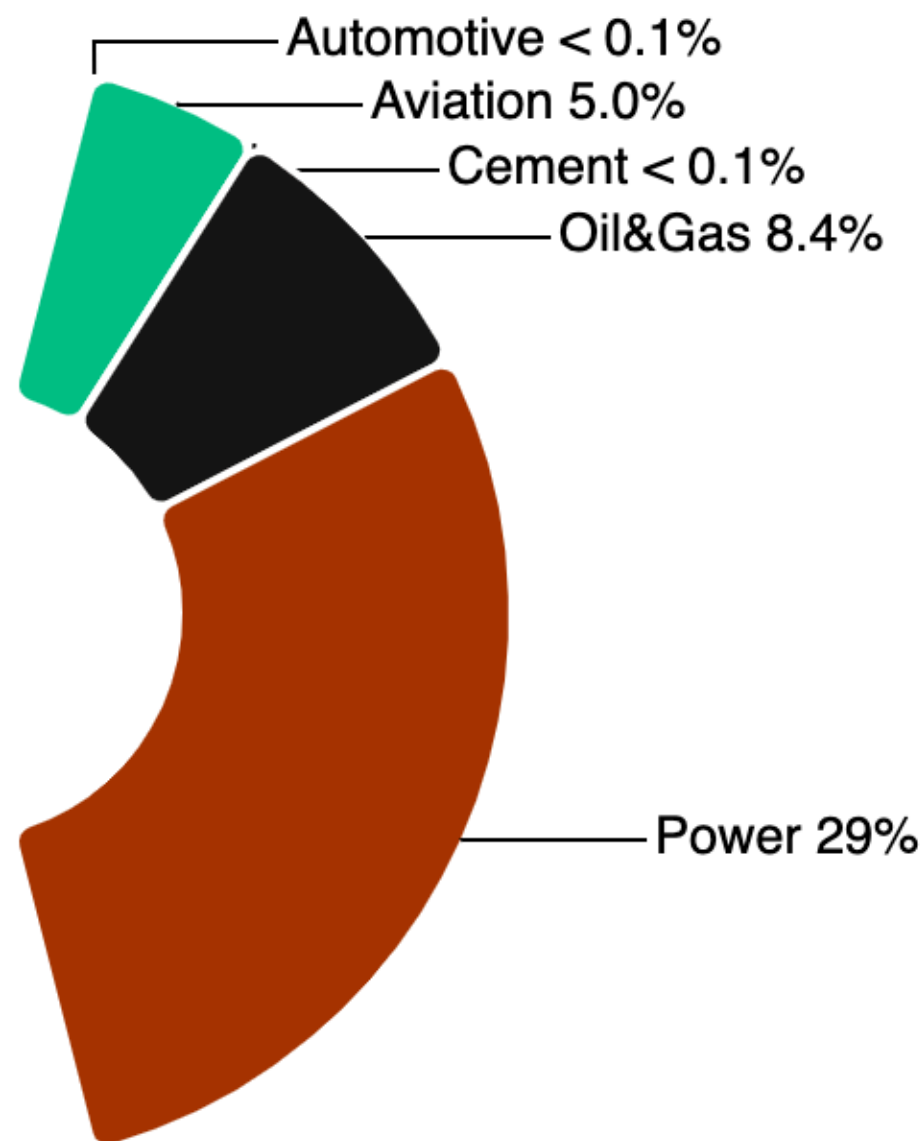


# Pacta Analysis

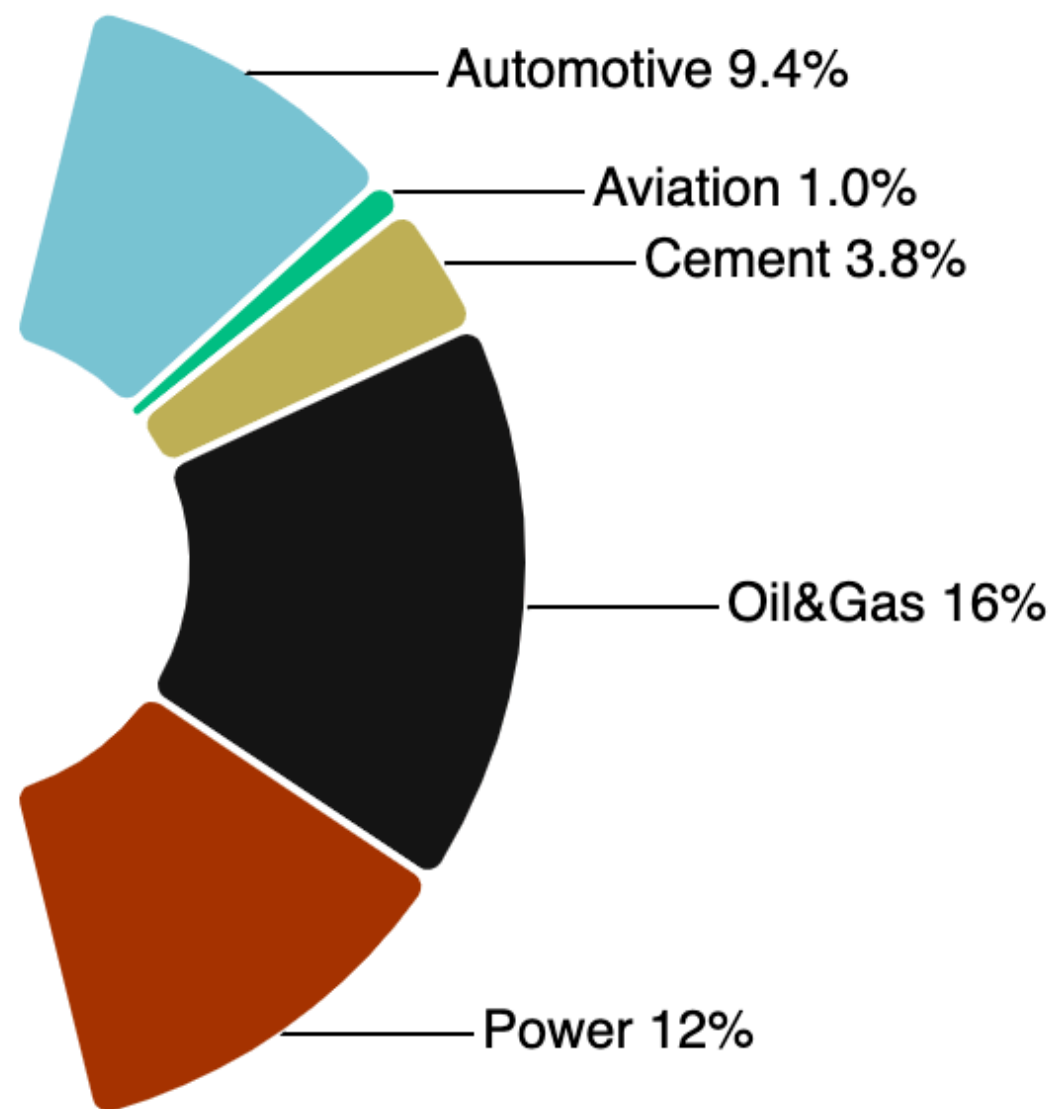
Portfolios are determined at the end of 2023

## Emission exposure from climate-relevant sectors

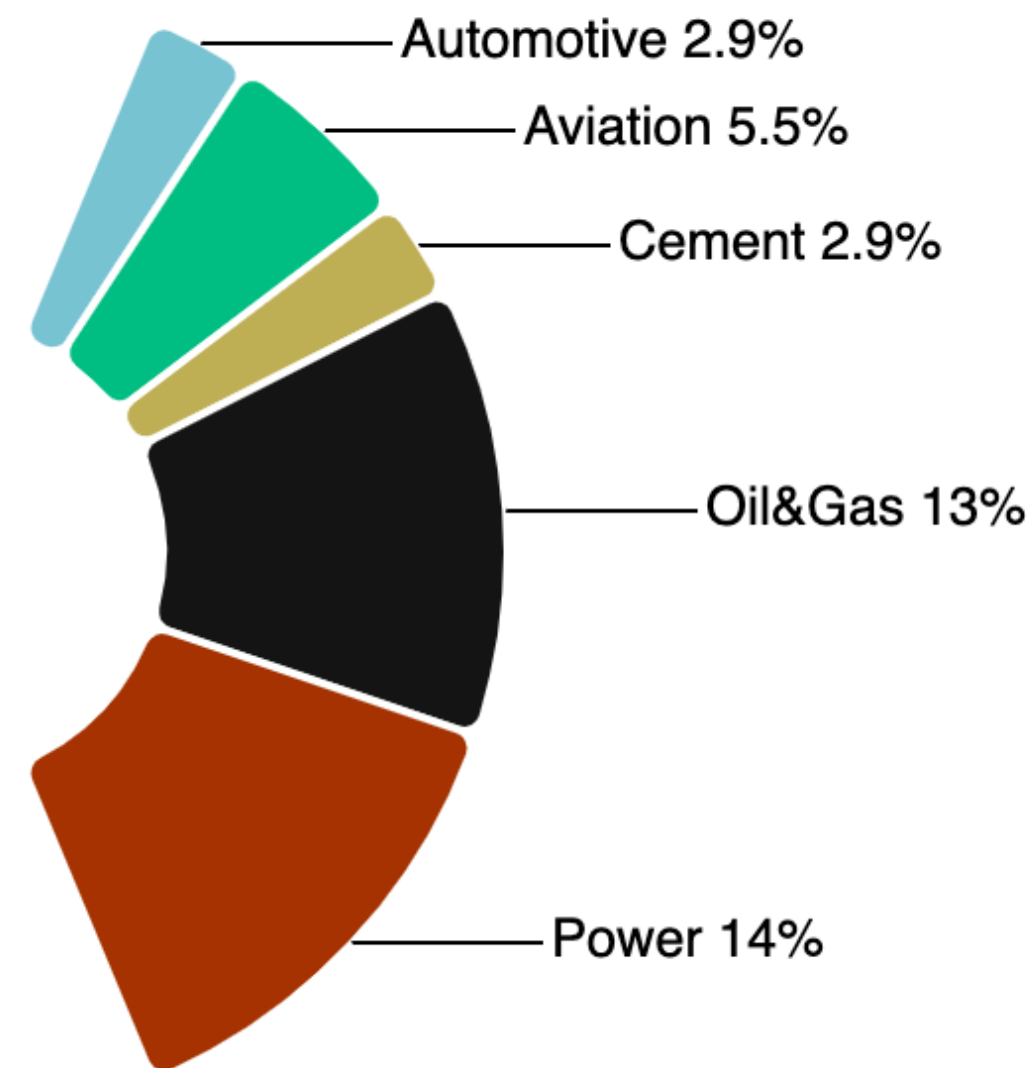
Pure Financial



ESG Score



Emissions per Revenue



# Macroeconomic context

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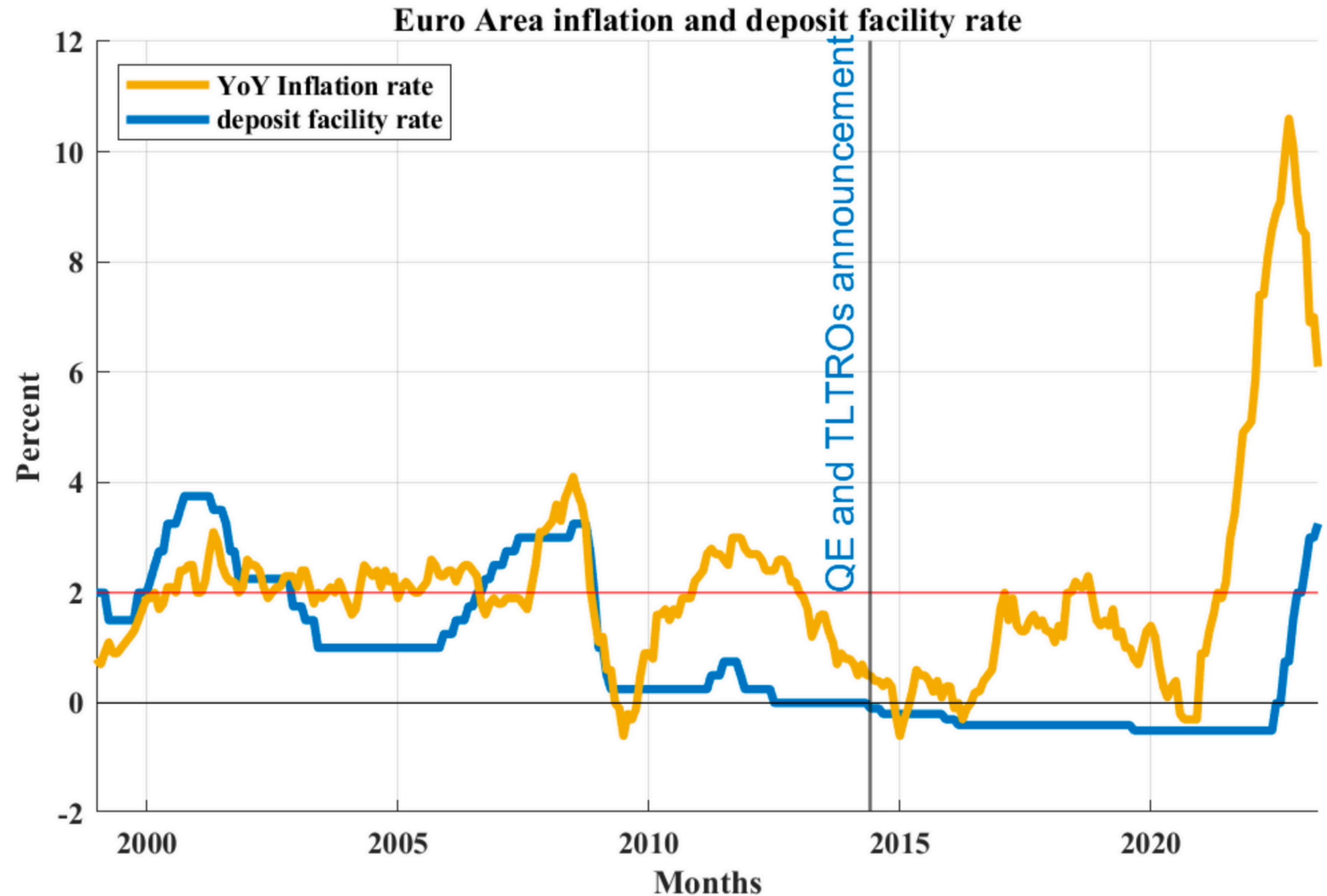
## 2020-2021: CORONAVIRUS PANDEMIC

- Lockdowns
- Remote work
- Recession
- Interest rates are cut + QE
- Supply chain bottlenecks
- Inflation picks up

## 2022-2023: ENERGY CRISIS

- Rising interest rates
- War in Ukraine
- Rising energy prices
- Inflation accelerates

# Macroeconomic context

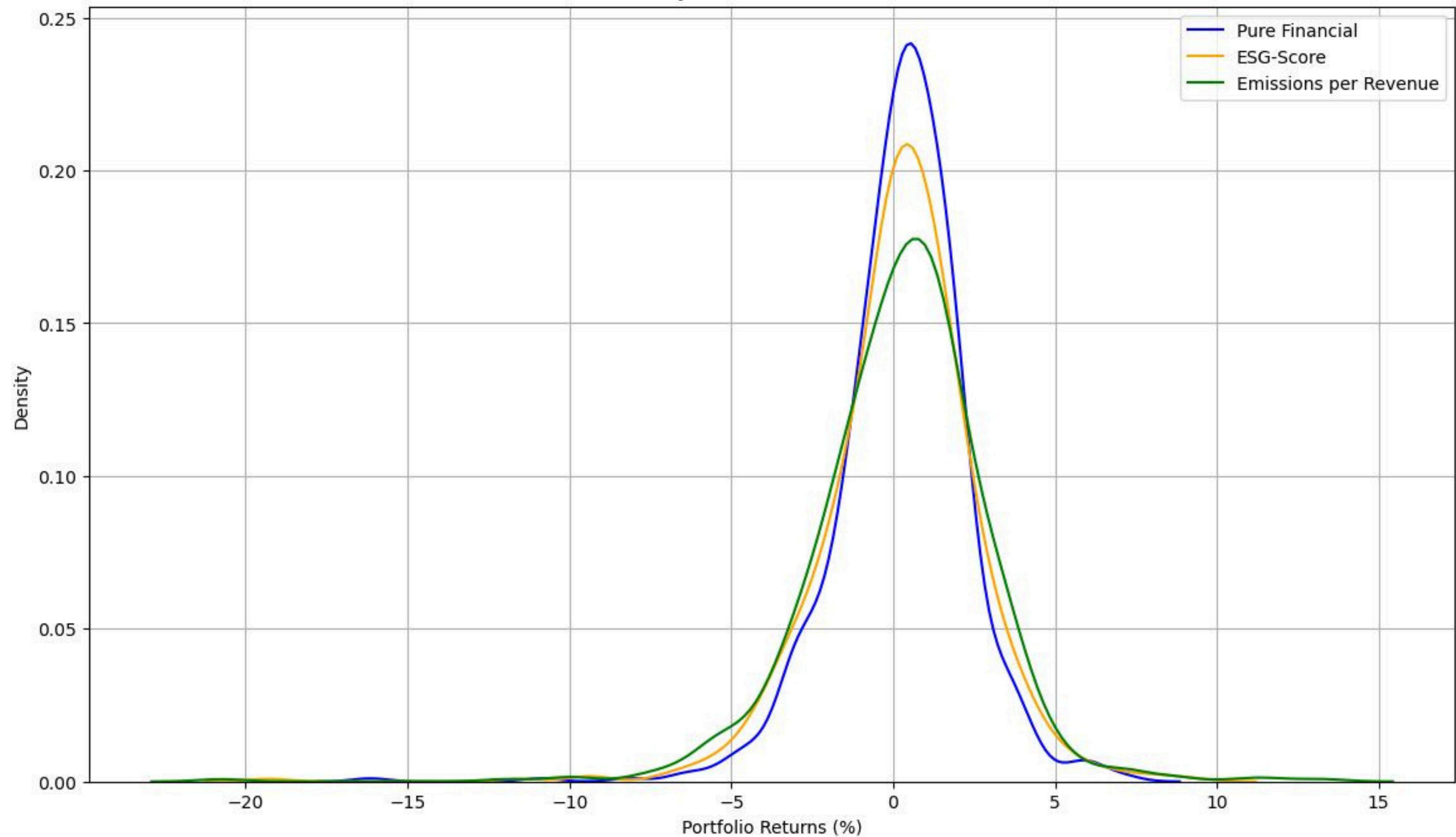




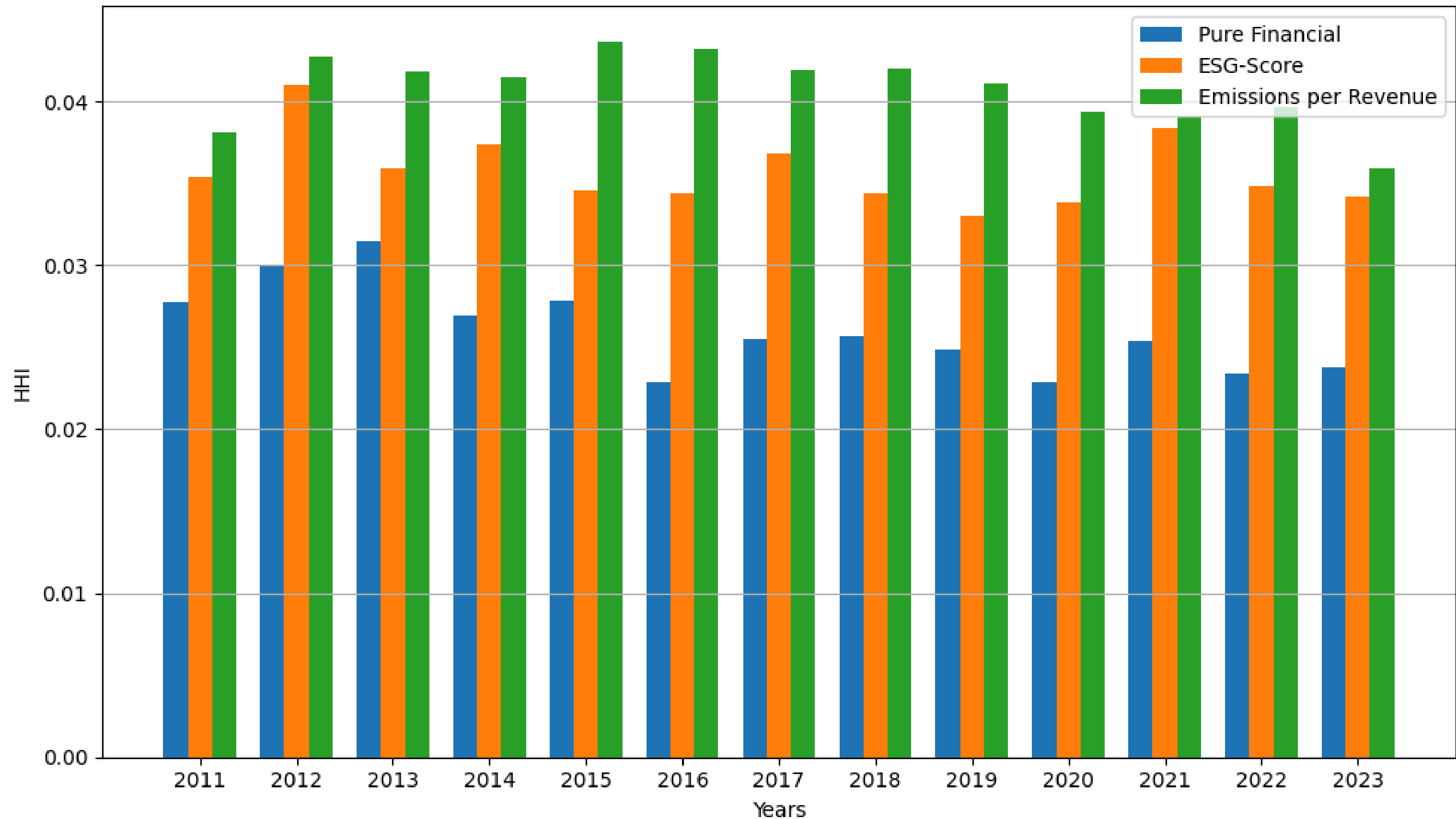
# Cumulative Portfolio Returns



# Cumulative Kernel Densiy

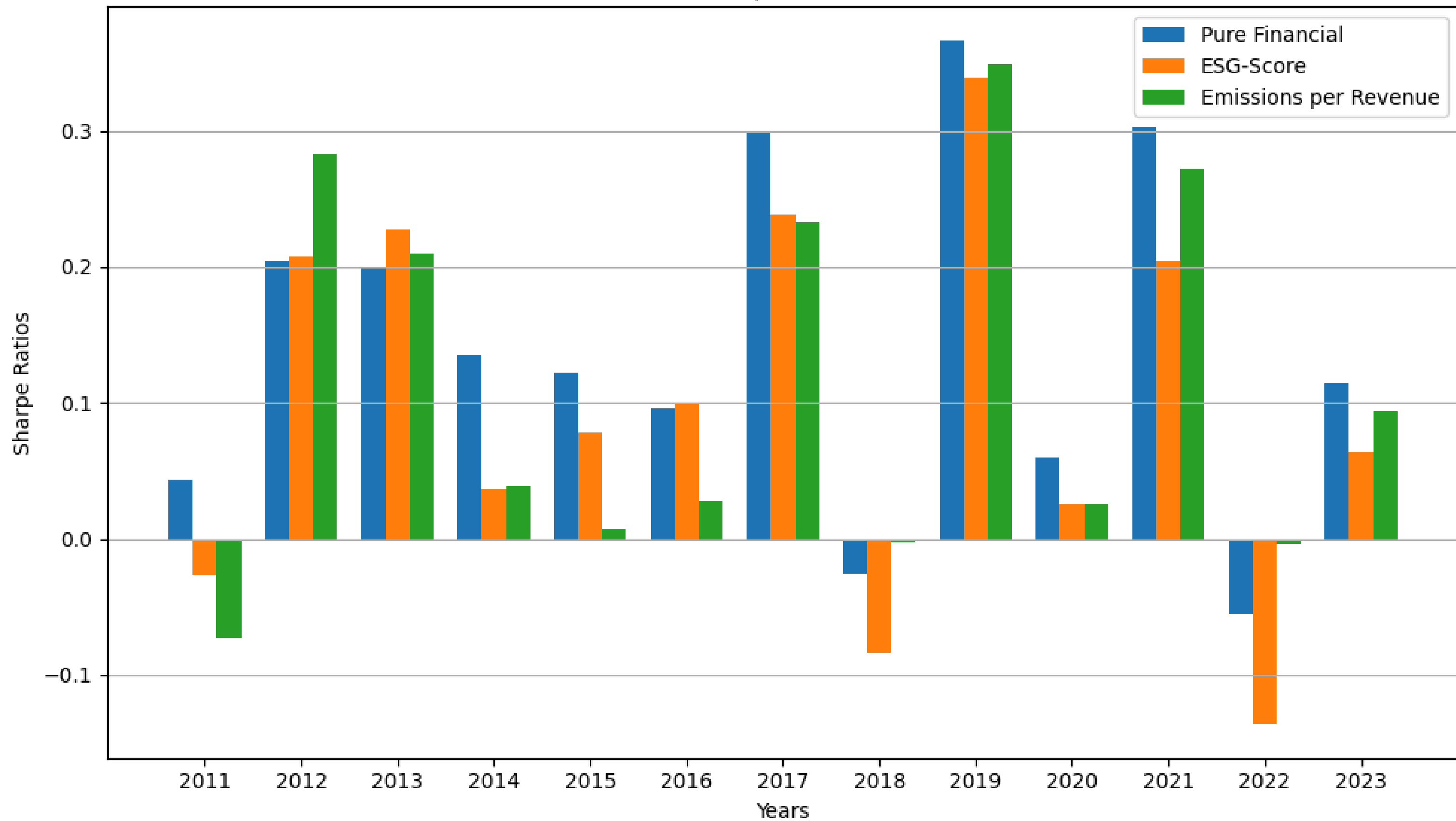


# Herfindahl-Hirschman Index (HHI)

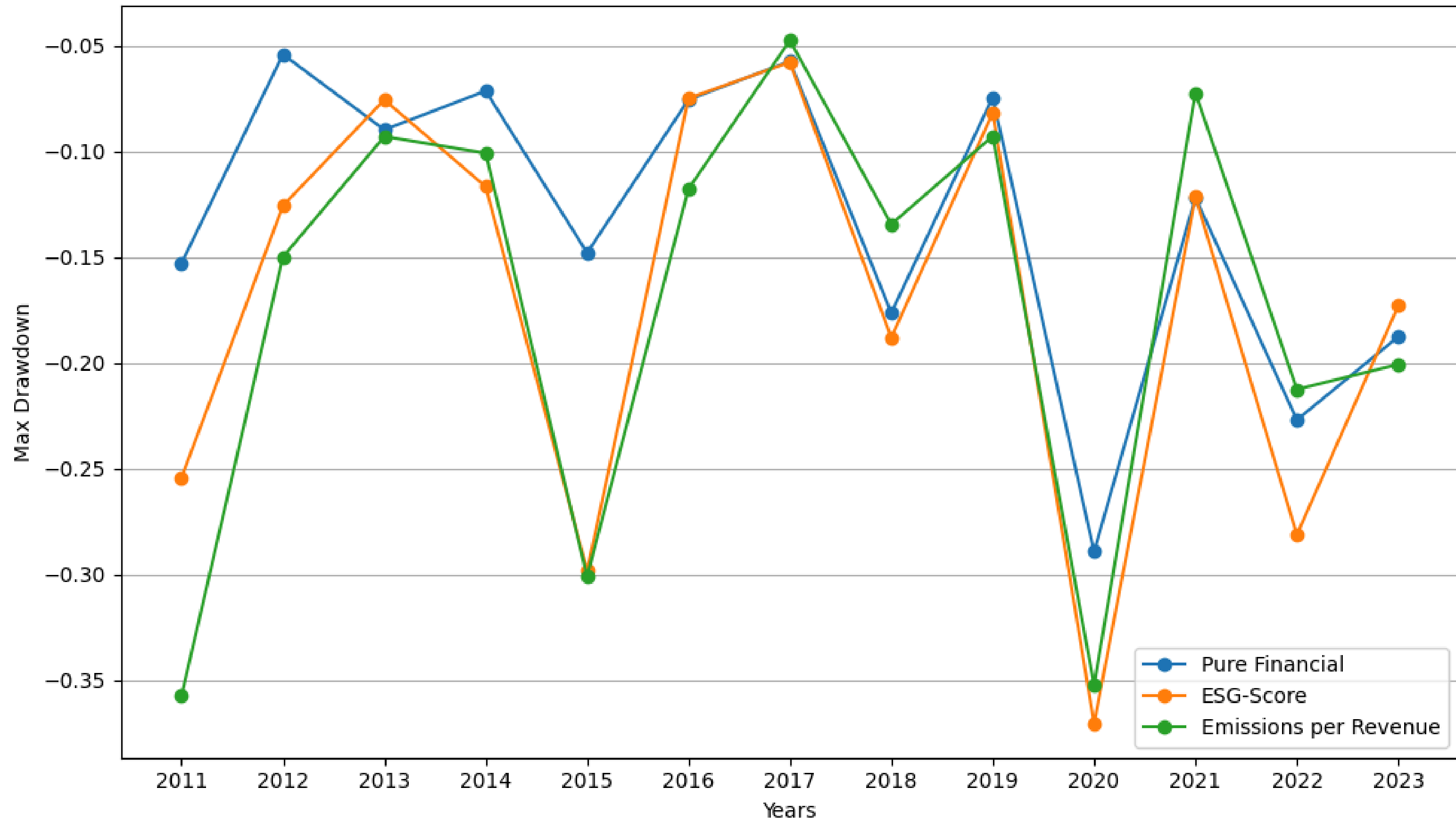




# Sharpe Ratio

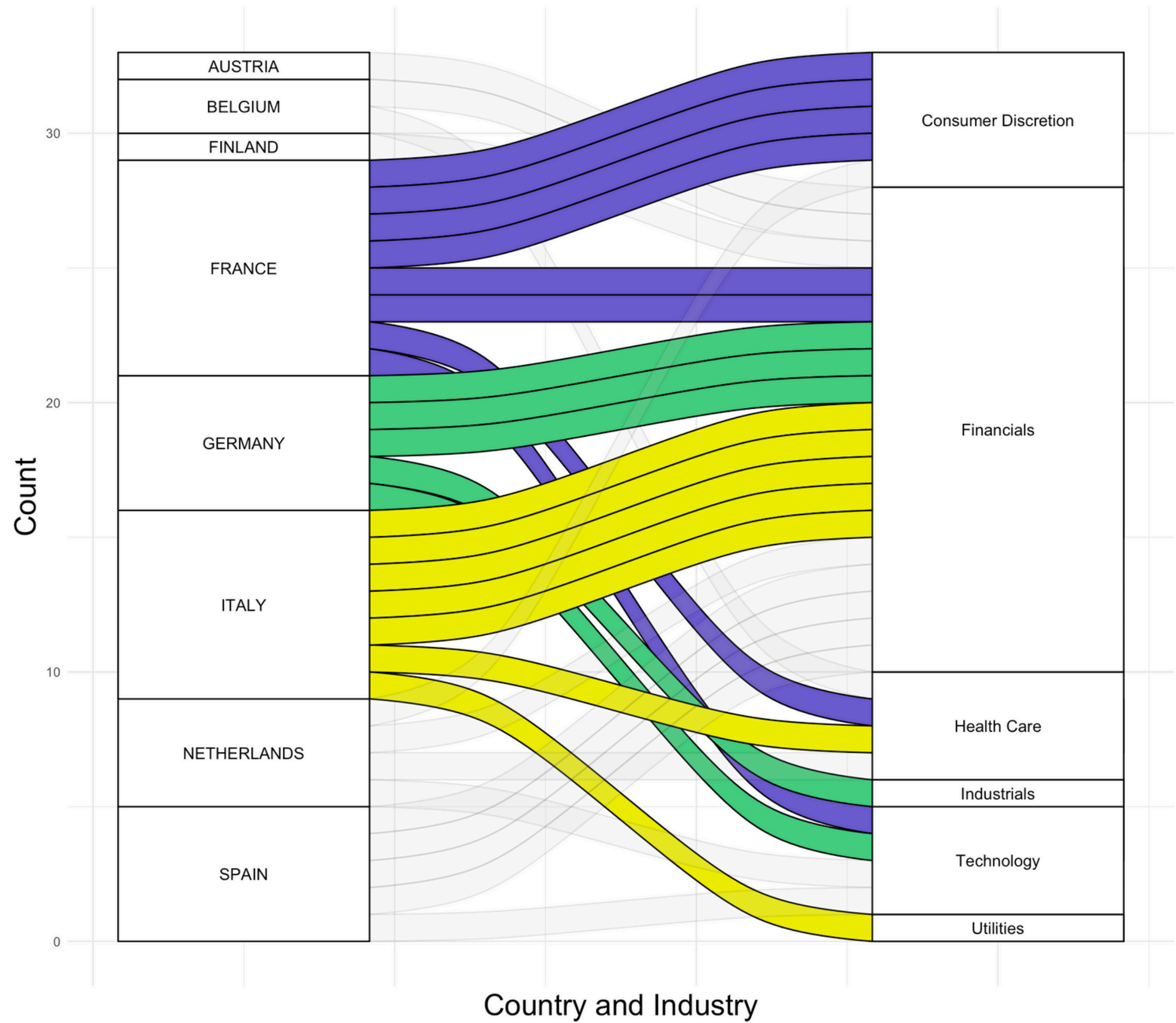


# Maximum Drawdowns



# Emissions per revenue portfolio

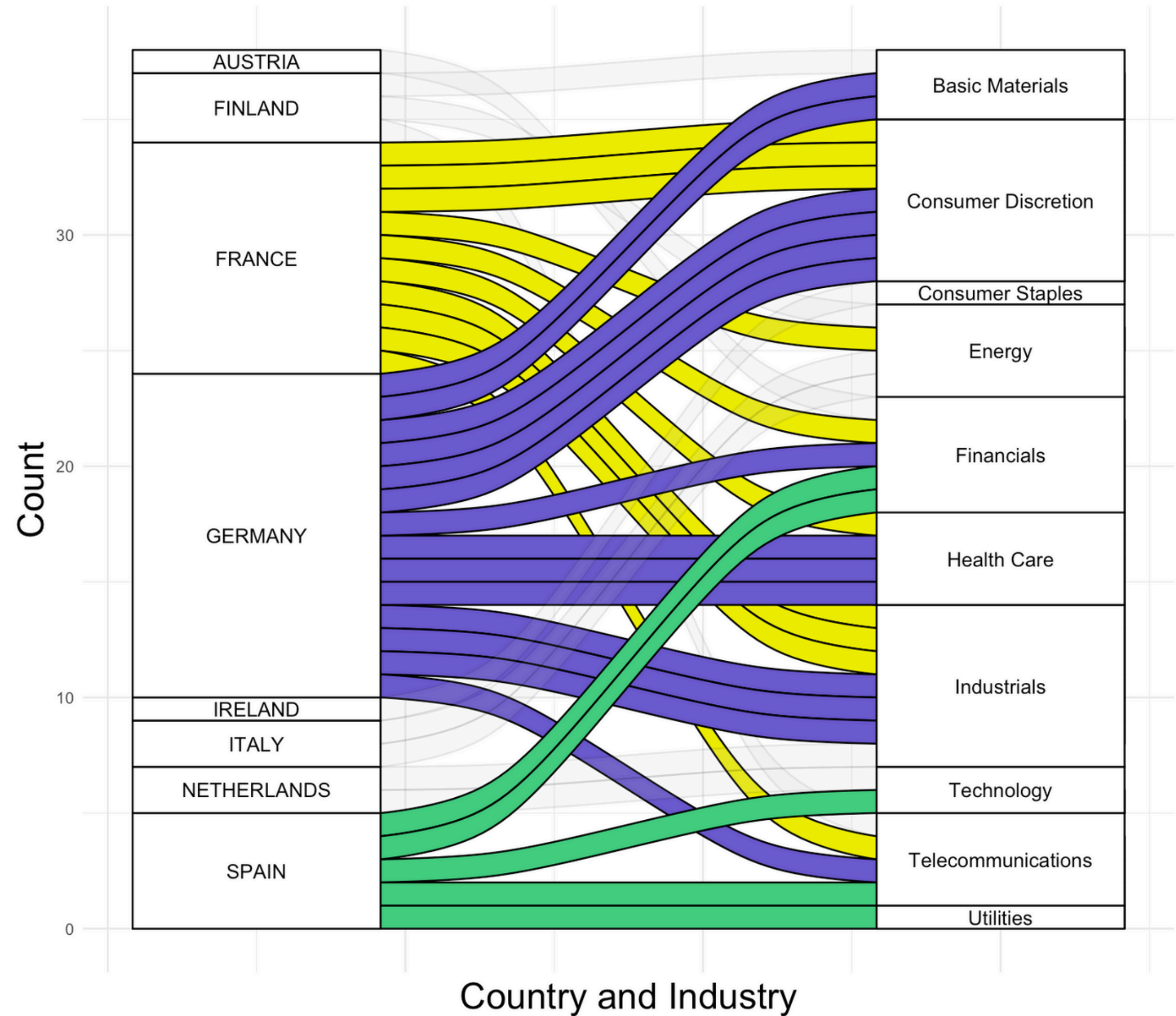
determined  
at the end  
of 2021





# ESG score portfolio

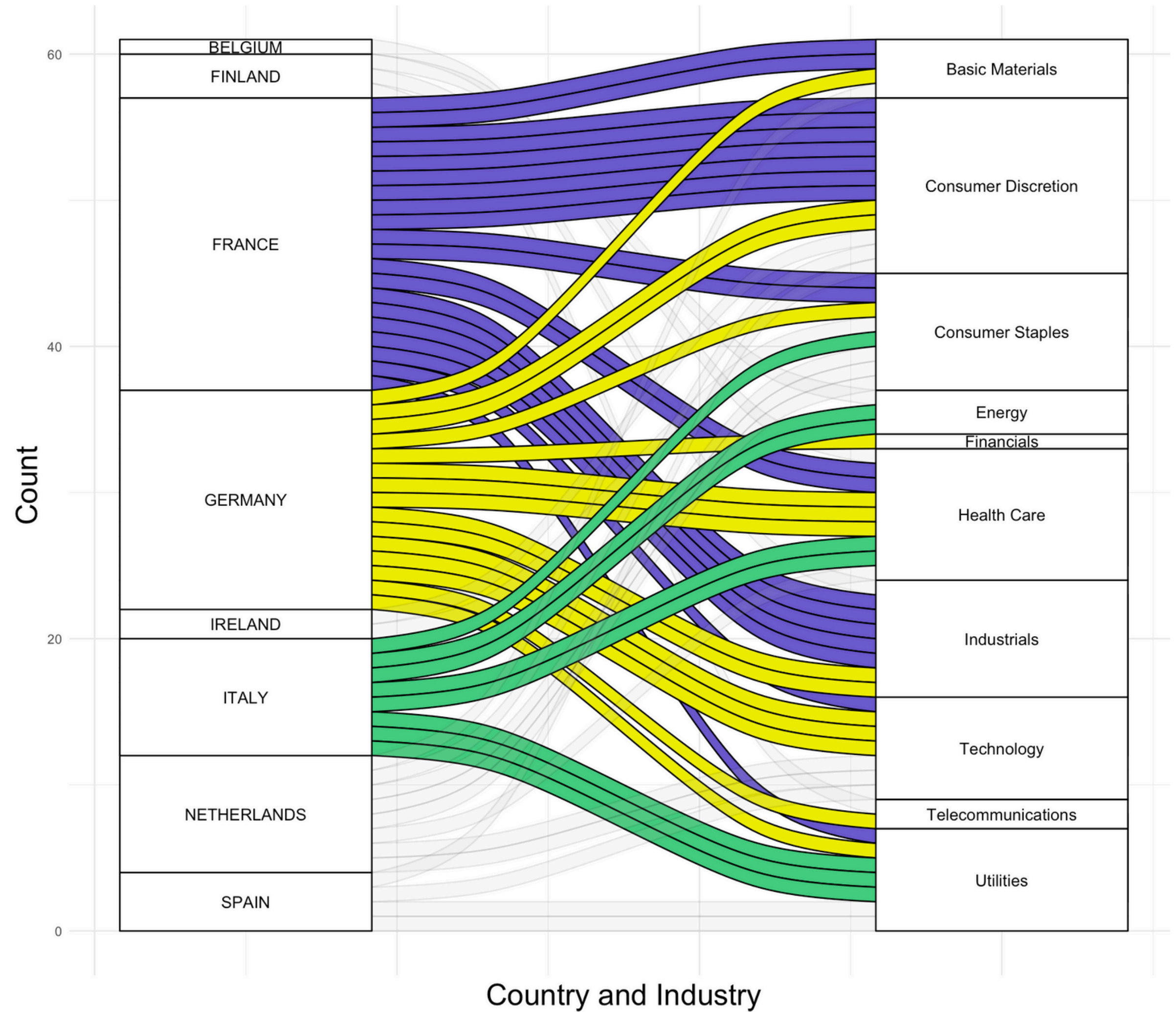
determined  
at the end  
of 2021





# Pure financial portfolio

determined at the end of 2021





# Conclusions

- **Markowitz** limitations.
- Looking backward, **Purely Financial strategy** outperforms the ESG Score and Emissions Per Revenue strategies. Looking forward, there are physical climate risks and transition risks.
- **ESG Score strategy** – We cannot compare ESG Scores between industries. Some highly ranked ESG companies are not in the set of 150 stocks we considered.
- During the COVID-19 crisis, the **CO2 strategy outperforms**, because of high revenue and low emission sectors.

Thank you for your  
attention!

Danke für die  
Aufmerksamkeit!

Merci pour l'attention!

Grazie per l'attenzione!



# Appendix

## Performance Analysis

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- PACTA Tool Overview







## PHYSICAL ASSETS IN THE REAL ECONOMY

Physical assets in the real economy and their corresponding production values are mapped to loans, equities and bonds



## FINANCIAL INSTITUTIONS PORTFOLIOS

Alignment of loan books, or investment portfolios are benchmarked against climate change scenarios and the market



## CLIMATE SCENARIOS

### METRICS



PACTA outputs a number of metrics, for example: production trajectory alignment, technology mix, emission intensity. They can be accessed in a number of tools, for example software packages, interactive reports, meta-reports.

