

# The Use of Short Selling to Achieve ESG Goals

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**Managed Funds Association**  
The Voice of the Global Alternative Investment Industry

[managedfunds.org](http://managedfunds.org)

# Forward

Between the SEC's proposal to require mandatory climate reporting by public companies and significant volatility in global energy markets, never has the urgency of environmental, social, and governance (ESG) issues such as climate change been so front-and-center for regulators and investors alike.

That's why the investment industry needs to marshal all the tools at its disposal to address these important issues. Short-selling companies with large carbon footprints has the advantage of helping investors reduce their climate risk while also expressing their sustainability goals and values. Whether it's in energy, transportation, or manufacturing, shorting securities offers two clear benefits. First, it further increases selling pressure on a specific security. Second, it allows investors the ability to become shareholders for change in a company without creating more ESG risk in their portfolio.

This important paper by the Managed Funds Association, in conjunction with Copenhagen Economics, details how short selling can contribute to increased capital allocation towards carbon neutral investments. It applies the theory to several scenarios and numerical examples, showing the positive impact short selling can have in pressuring companies to reduce greenhouse gas emissions.

To the same degree that owning a security helps a company finance itself and gives the owner a carbon footprint, holding a short position hinders a company's finances and gives that holder a negative carbon footprint. Counting short positions as having a negative carbon footprint also helps facilitate positive engagement with those companies that need to change.

As more and more investors and corporations make net-zero emissions commitments, reaching a consensus on accurate carbon accounting is vital to achieving our collective aims. Even as it is important to avoid the trap of "double counting" carbon footprints, investors who short carbon emitters should get credit against their carbon footprint for doing so. This will be critical to the asset allocation decisions of many endowments, foundations, and smaller pension funds that invest in hedge funds.

Since shorting equities is a small fraction of the overall market, accounting for the carbon footprint of a short position will not eliminate the need for larger investors to act upon their sizable existing carbon footprints. But the last thing we want to do is penalize engaged—but properly hedged—investors by assigning them large carbon footprints because of misidentified offsetting short positions.

We at Harvard Management Company have learned from past experience that it is critical to develop standards around reporting so that fund managers are not overwhelmed with many unique informational requests from their LPs. We hope to see the asset management industry unify as much as possible around consistent standards to avoid competing views that could stall the process of reducing carbon from portfolios.

Ensuring that all means of reducing emissions are incorporated in our calculations will help us achieve our ESG goals.



**Michael Cappucci**  
Harvard Management Company  
Managing Director, Sustainable Investing

## Summary Points

- Incorporating short selling as part of an ESG-focused investment strategy can help shift capital away from high-emissions companies all while limiting losses for investors.
- Short selling has the potential to help reallocate \$50-\$140 billion of capital away from the most heavily polluting companies.
- To realize the full potential of short selling as an ESG tool, short positions of a high-emissions company should be counted separately or netted from the long positions when evaluating the ESG risk of a portfolio.

## EXECUTIVE SUMMARY

Environmental, Social, and Governance (ESG) is becoming increasingly important to many investors. The growing focus on the risks of climate change has permeated many fields, with prominent voices such as former Bank of England Governor Mark Carney arguing that asset managers have a significant role to play in promoting the transition to a net-zero economy. Allocators of capital, such as the Harvard Management Company, have made reaching a carbon-neutral portfolio a top priority.<sup>1</sup> But how should one count the emissions generated by a portfolio? In particular, how should the emissions produced by companies that are sold short be counted? This paper showcases how short selling can be an essential tool to accomplish ESG goals by helping reallocate capital away from high-emissions companies all while maintaining investment performance.

Then, we introduce an equity demand model which shows that short sales have the potential to change the supply-demand balance for individual stocks and then estimate the effect of short sales on the allocation of capital. The paper then quantifies how the climate transition could have a differential effect on various sectors and how short selling allows investors to hedge that risk. In particular, the paper shows that short positions have the potential to reduce capital investment in the most emissions-heavy publicly traded companies by 3-8%.

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1: <https://www.hmc.harvard.edu/net-zero/>

## The Current Debate of ESG and Short Selling

### What are Short Sales?

Short selling is an essential, regulated trading tool that hedge funds use to expose fraud and corruption, reduce risk, enhance market integrity, and keep markets honest. Mechanically, this is accomplished by borrowing a share of stock from an owner and selling it, with the promise of buying it back and returning it later. Shorting has a very important role in modern financial markets, and sellers have a variety of motivations. Some investors short to try to take advantage of perceived overpricing while others do it as a part of a larger hedging or liquidity provision strategy.

### How Might Short Sales Be Incorporated Into Portfolio Metrics

A portfolio is a combination of underlying positions. With traditional long (e.g. ownership) positions, creating an aggregate statistic for a full portfolio is relatively straightforward; it is just the total of the individual components. Be it earnings, stock price momentum, or carbon emissions intensity, the process is the same. One gets data for as many of the constituent investments as possible and then adds them together, with appropriated weighting by their share of the portfolio. These weights are then used to both classify as well as construct portfolios.

Short selling adds a wrinkle to creating summary portfolio statistics with two obvious solutions. One can include the short positions but assign them negative weight or one can separately report a summary of long and shorts. The first approach has the advantage of creating a single summary statistic, which is helpful when comparing portfolios. The second approach provides more information but can complicate the ability for investors to compare across portfolios.

Two other approaches, ignoring the shorts or including them as if they were long positions, are clearly unsatisfactory. Short positions have an impact on portfolios, just as longs do. Ignoring them fundamentally misrepresents a portfolio's exposure. But the economic implications from a short are the opposite of a long, so treating them identically would lead to incorrect conclusions about a portfolio's composition and exposures.

### ESG Metrics at the Portfolio Level

ESG is becoming an increasingly important focus for many investment managers in their investment processes and fund-raising efforts. Managers often consider climate and other ESG-related risks as part of their standard risk analysis process when making investment decisions. Many managers have specific ESG criteria they consider when selecting assets and when serving as asset owners.

Amel-Zadeh and Serafeim (2017) surveyed 413 investment professionals at firms with \$31 trillion in AUM and found that appealing to potential investors via high ESG awareness is an important concern. One third (33%) cited growing stakeholder demand as being a motivating factor for ESG investing, while 32.6% said ESG was part of their commercial strategy, and another 25% were already operating under client mandates.

Investors have a variety of financial and moral motivations for preferring asset managers who have high ESG integration. For example, an investor might believe that it is both a moral imperative to engage in responsible investing and that such an investment strategy is likely to outperform one that does not take ESG impacts into account. Whatever the motivation, it is important that ESG metrics, such as commercial ratings, adequately reflect the underlying exposures and real-world impact of the actual portfolio. Most investors are reliant on such a third-party evaluation of their asset managers' ESG performance owing to both time and data limitations.

Researchers have uncovered a variety of ways that ESG information might affect investment performance. Indeed, Christensen (2018) uncovered no fewer than 380 papers related to ESG reporting. ESG disclosures are associated with lower capital constraints (Cheng et al. 2014), cost of capital (Dhaliwal et. al 2011), analyst forecast errors (Dhaliwal et. al 2012), and with stock price movements around mandatory ESG disclosure regulations (Grewal, Riedl and Serafeim 2017). Firms with better disclosures are more valuable (Plumlee et al. 2015) while firms which do not report climate risk, such as carbon emissions in some cases, may see some negative impact for their stock prices (Matsumura et al).

If ESG metrics do not accurately reflect the economic exposure a portfolio has to underlying ESG factors, they simply will not serve as reliable economic indicators. This means short positions must be appropriately accounted for by either reporting them separately or netting them from the long positions.

**Firms that do not report climate risk may see some negative impact for their stock prices.**

Consider an extreme example. Suppose there was a fund whose mandate was to be 100% short ESG unfriendly companies. That fund would benefit -100% on the ESG investment factor; but under an approach where shorts count like long positions, this fund would be classified as being the opposite, having a 100% exposure to ESG risks. Clearly investors would not be properly informed based on that metric and would also likely come to distrust ESG ratings in general.

## How Short Selling Can Contribute to Increased Capital Allocation Towards Carbon Neutral Investments

A central question in ESG investing is whether the practice of selecting stocks based on their environmental impact influences capital allocation, making it relatively easier for greener companies to fund their investments. If this is the case, shorting heavy emitting companies should have similar effects on capital allocation i.e., direct investments away from fossil-fuel based companies.

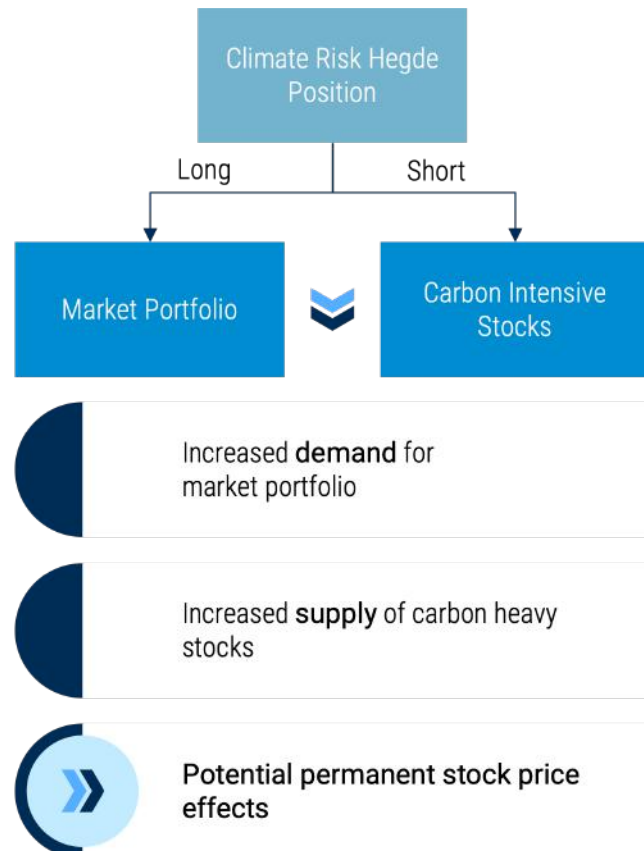
Therefore, in this section, we investigate how hedging against climate risks effects the availability of the stock supply and estimate the impact on capital allocation of shorting carbon-heavy stocks.

### Climate Hedging Affects Liquidity Of The Stock Supply

A hedging position that takes a short position in a carbon-heavy stock (and a long position in the market portfolio), increases the supply of the stock; it also increases the number of supply orders in the book (and increases the number of demand orders in the general market), see Figure 1.

FIGURE 1

Illustration of the stock supply effect of hedging



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Whether such a position has a permanent price effect on the stock depends on the market response to the change in supply induced by the short position. The short position will tend to put downward pressure on the stock price. If this oversupply is not offset by an increase in demand orders reacting to the lower price, the short position will have permanent price effects.

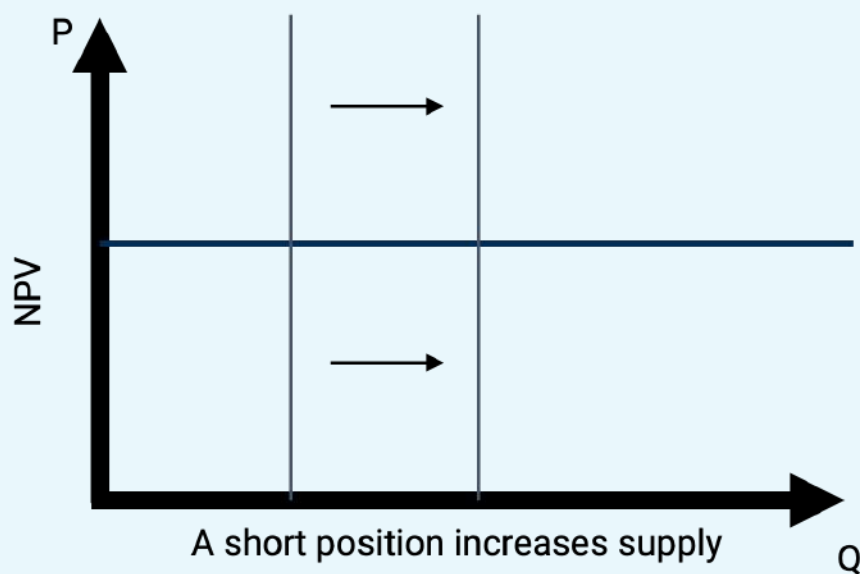
The magnitude of the price effect depends on the ability of other investors to react to prices. If this ability is limited, the impact of short positions may be large. If other investors react strongly to idiosyncratic price movements, short selling may only have a limited effect on stock prices and capital cost.

According to traditional financial theory, where the stock price equals its fundamental value, a hedge cannot affect the allocation of capital.<sup>2</sup> If a hedging position drives prices on carbon-heavy stocks down while the market portfolio is pushed up, this will drive a wedge between the expected risk-adjusted return on carbon-heavy stocks and their price. This means that investors will be able to earn an excess (risk adjusted) return on carbon-heavy stocks. This excess return can be captured by using the opposite position, going long in carbon-heavy stocks and short in the market portfolio.

Consequently, the stock market's reaction to an expansion of the supply book will be an unchanged market price, since the market is willing to demand an infinite amount of the stock at a price equal to the NPV. Hence, short positions in carbon-heavy stocks will have no effect on the cost of capital of carbon-heavy industries, see Figure 2.

**FIGURE 2**

Illustration of price effect according to classical finance.



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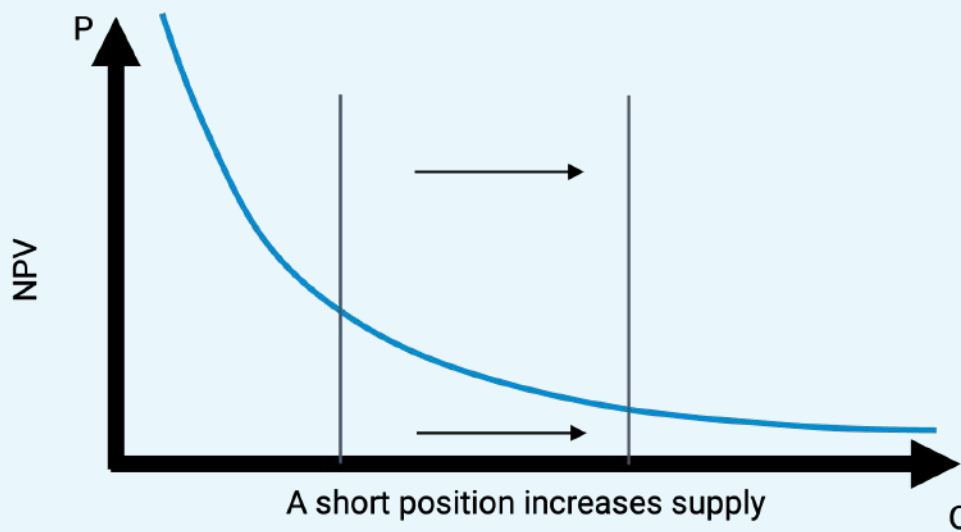
While it is a subject of academic debate to what degree the stock prices can be said to be efficient and determined by fundamentals, a lack of complete efficiency is necessary for ESG-driven investing to have any effect. If ESG investors were completely counterbalanced by arbitrage-hunters taking opposite positions, ESG investing would not be able to affect the stock prices and thus also not the cost of equity of the polluting firms.

It has been documented that the demand curve for equity slopes downward, implying an increased short interest in a stock may affect the stock price (see also the section below, where we present elasticity from different empirical studies).<sup>3</sup> This contradicts the efficient market hypothesis, but is an empirically well-supported prerequisite for ESG investing to affect the weighted average cost of capital (WACC). If inflows or outflows from an asset do not affect the price, ESG investing cannot affect the WACC and thus not the level of gross investments.

In practice, the observed fact that stock demand slopes downward can be explained by the fact that a large share of market participants are unable to react to stock mispricing the way that classical finance models require. For instance, 80% of the equity in S&P 500 is held by institutional investors.<sup>4</sup> These often operate under a mandate which limits their ability to react to stock mispricing. Thus, the landscape of stock ownership creates an inertia in the stock market's reaction to mispricing, meaning the stock market will not be able to absorb an infinite quantity of stock at a price equal to the NPV, see Figure 3.

**FIGURE 3**

Illustration of price effect according to empirical results.



3: Gabaix, X., and Koijen, R. S. J. (2021). In search of the Origins of Financial Fluctuations: The Inelastic Markets Hypothesis. National Bureau of Economic Research – [Link](#)

4: Pensions & Investments. (2021). 80% of equity market cap held by institutions. – [Link](#)

De La Cruz, A., Medina, A., Tang, Y. (2019). Owners of the World's Listed Companies. OECD Capital Market Series. – [Link](#)



### Impact On Capital Allocation By Shorting Carbon-heavy Stocks

As discussed above, shorting carbon-heavy stocks would likely have an impact on equity prices. This means shorting also impacts the cost of capital and eventually capital allocation – just as ESG investing can influence capital allocation.

To analyse the effects of shorting, we estimate the impact on capital allocation of shorting carbon-heavy stocks under two scenarios:

**Scenario 1:** Evaluating the effect on WACC (weighted average cost of capital, a key measure of how much business investments cost) and total capital allocation of the current level of short interest on carbon-heavy stocks (i.e., compared to a situation of assets were not shorted at all).

**Scenario 2:** Evaluating the effect on WACC and total capital allocation if shorting of heavy emitting companies is fully used by investors to hedge climate risks (i.e., shorting increased to 10% of total market cap, which is assessed to be the maximum amount these assets realistically can be shorted over a longer time period ).<sup>5</sup>

Our analysis focuses on short positions in the top 16 emitters, which are responsible for around half of all emissions (although their market capitalization only constitutes about 5% of the S&P 500). The idea is that investors would likely focus on shorting a few selected companies with high emissions to get an effective hedge against climate risks.

### Assumptions in our Estimation

To estimate the impact on stock prices from shorting, we use a somewhat conservative stock demand elasticity of -2 based on empirical estimates,<sup>6</sup> see Table 1 in the Appendix. The estimates vary in magnitude between papers from -0.2 to -3000. A numerically small elasticity implies that flows in and out of stocks have a large price effect while numerically large elasticities imply a small price effect.

Another important assumption is the extent that higher cost of capital reduces capital allocation. Here, we assume a capital stock elasticity of between 1-2.5, based on a previous study by Copenhagen Economics<sup>7</sup> (see more details in the Appendix). This means that capital allocation for a given company declines by 1%-2.5% for each one percent the weighted capital costs increases. This is also called Weighted Average Cost of Capital (WACC), which is the rate that a company is expected to pay on average to all its security holders to finance its assets, both equity and debt.

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5: See appendix for the intuition behind 10% short interest

6: Chang, Y. C., Hong, H., Liskovich, I. (2014). Regression Discontinuity and the Price Effects of Stock Market Indexing. National Bureau of Economic Research – [Link](#)

7: Copenhagen Economics. (2021). Financial transaction tax study: impact on pension savers and the real economy – [Link](#)

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The dynamics from higher capital costs to lower capital allocation are as follows: The higher cost of capital increases the required return an investment must have to be economically viable. This decreases the level of profitable investments for each company, giving rise to a lower capital allocation in steady state. For example, assume that a company's WACC increases from 5% to 6%. After the WACC increase, investments with an expected return in the range 5%-6% will not be conducted, whereas they would before the WACC increase.<sup>8</sup>

The elasticity between capital costs and capital allocation is difficult to identify empirically. We therefore derive our elasticity from macroeconomic models, meaning it has significant uncertainty on a company level. This uncertainty is reflected in the rather wide range of 1-2.5, which we employ.

### Scenario 1:

In this scenario, we estimate how the current level of shorting has impacted WACC and capital allocation. Concretely, we assess the change compared to a situation of no shorting of the assets, to the current level of the short interest.

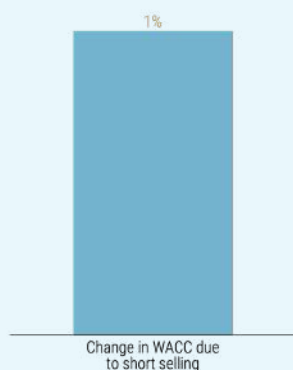
First, we find the WACC increases with an average of 0.045 percentage points for the heavy emitting companies, corresponding to a relative increase in WACC of 1%, see Figure 4.

Second, we estimate this increase in WACC results in a decline in capital allocation in the range of 1%-2% for the 16 top emitting companies. This corresponds to USD ~15-40bn. As mentioned, the range is due to uncertainties in the elasticity between WACC and capital allocation.

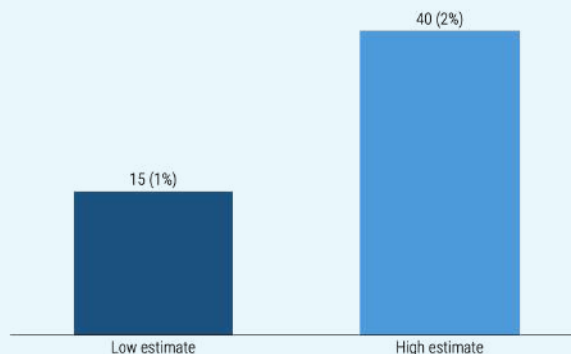
### FIGURE 4

Scenario 1: Change in WACC and total assets

**Average change in WACC for top 16 emitters**  
Percent



**Change in capital allocation of top 16 emitters**  
Bn USD (percentage change in capital allocation)



8: Finally, we assume a WACC of 4.4% based on sector average estimation by Damodaran, A. (2021). Data on coal and related energy, oil and gas, and utilities – [Link](#). For a description of the foundation of our model assumptions, see Appendix.

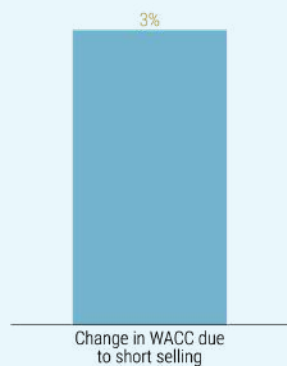
### Scenario 2:

In this scenario, we simulate the impact if shorting is used to the full extent in order to hedge climate risks. Concretely, we assume the heavy emitting stocks (top 16) is shorted by up to 10% of total market cap, which is assessed to be the maximum amount these assets realistically can be shorted over a sustained period.

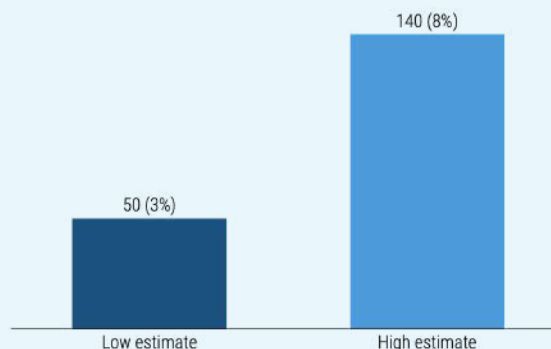
First, we find that WACC increases with an average of 0.13 percentage points for the heavy emitting companies, corresponding to a relative increase in WACC of 3% on average, see Figure 5.

Second, we estimate that this increase in WACC results in a decline in capital allocation in the range of 3-8% for the 16 top emitting companies. This corresponds to ~\$50-\$140bn. As mentioned, the range is due to uncertainties in the elasticity between WACC and capital allocation.

**Average change in WACC for top 16 emitters**  
Percent



**Change in capital allocation of top 16 emitters**  
Bn USD (percentage change in capital allocation)



## Portfolio Climate Risks Mitigation Through Short Selling of Carbon-Heavy Stocks

In the previous section, we described the effect short selling could have on emissions-intensive investments. In this section, we demonstrate this through a numerical example of a generic portfolio resembling the S&P 500 index.

There is no single correct way to short heavy emitting stocks to hedge against climate and other risks – there are likely as many optimal strategies as there are investors. Also, investors can use several tools to hedge against climate risks. For example, buying emission allowances (which likely would increase in value in a transition risk scenario shock) is another possible strategy.

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Thus, the purpose of the presented example is merely to showcase how shorting of heavy emitting stocks can be used to create a portfolio that would express the investment thesis that climate change regulations will be costly to some companies. As with all investment ideas, this might or might not come to pass, and we do not mean this example to constitute investment advice. Indeed, some investors will have a thesis that future climate change regulations will be less onerous than is currently expected by markets, and accordingly desire the inverse of the portfolio described below, e.g. one that overweighs heavily emitting sectors.

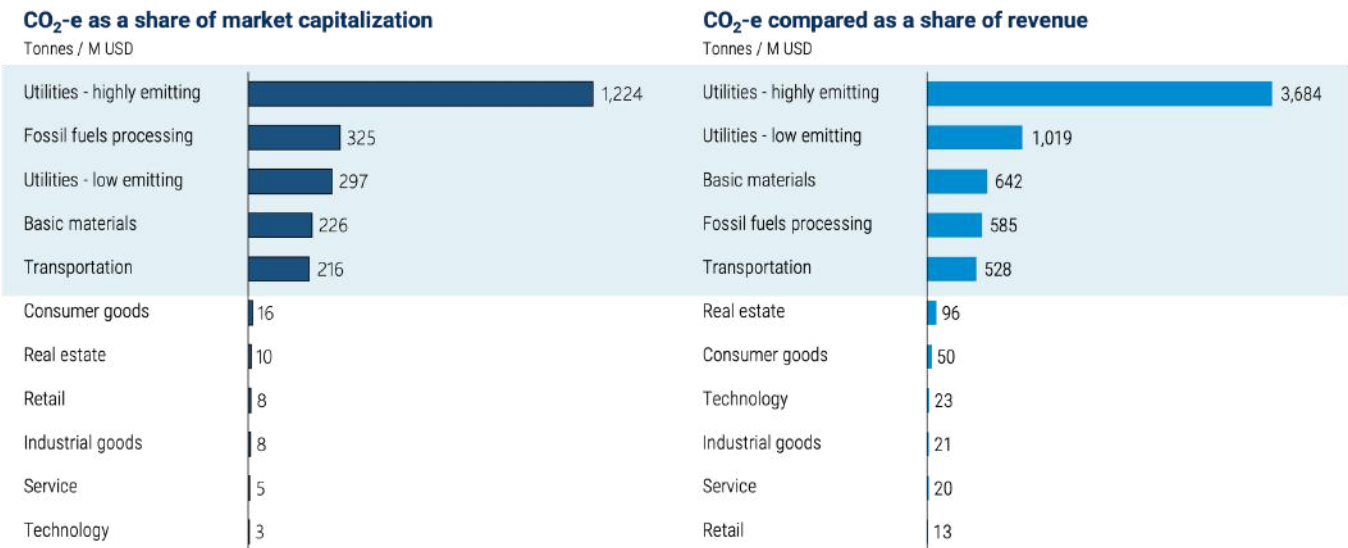
### Different Sectors' Exposure To Climate Risks

As a first step, we map out the climate risks within the different sectors represented in S&P 500, see sector definitions in Figure 13 in Appendix. Examining the different sectors' emissions as a share of market capitalization and revenue confirms the hypothesis from Section 1, namely that climate risks are largely concentrated at a few highly emitting companies. In fact, we find that the top 16 highest emitting companies make up around half of total scope 1 and 2 emissions from the S&P 500. Utilities primarily based on fossil-fuel energy, called Utilities – highly emitting, are responsible for more than one quarter of total emissions from S&P 500 companies.

This heterogeneity makes shorting of carbon-heavy stocks a useful tool to hedge against climate risks; investors can achieve large upside to climate risks through hedging relatively few heavy emitting companies.

**FIGURE 6**

Scope 1 and 2 emissions a share of market capitalization or revenue



Note: CO<sub>2</sub>-e measures scope 1 and 2 emissions. Scope 1: Green House Gas (GHG) emissions that a company makes directly. Scope 2: Green House Gas (GHG) emissions that a company makes indirectly

Source: Eikon



For utilities and companies involved with fossil-fuel based extraction and processing, we use a different approach. Here, we assume going forward they will be able to retrieve their current estimated cost of equity (i.e., initially be able to pass on the CO<sub>2</sub> price bill to their customers). The reason being that we expect it to be unlikely that renewable energy sources can be scaled up quickly enough to meet the demand entailed in the climate risks scenario of a gradual transition to carbon neutral in 2050. This means, for the years to come, fossil-fuel based energy will still be the marginal energy source, thus being decisive for energy prices. Instead, we assume production within fossil-fuel based assets will be phased-out following the phase-out projected by the International Energy Agency (IEA)<sup>9</sup>, see Figure 14 in Appendix.

We demonstrate concretely how shorting can be used to hedge climate risks via a numerical example on how companies' equity value is affected by a future carbon price of USD 150 per tonnes CO<sub>2</sub><sup>10</sup>, which is around the level of CO<sub>2</sub> price most international institutions expect is needed to incentivise transformation to carbon neutrality by 2050.

We construct three portfolios for our numerical example:

1. **Current portfolio:** A portfolio where an investor owns 0.1% of the S&P 500 index (only including stocks where emissions data is available).<sup>11</sup>
2. **Carbon divesting portfolio:** The current portfolio where heavily emitting companies are divested.<sup>12</sup>
3. **Carbon neutral portfolio:** The current portfolio where heavily emitting companies are divested and shorted until change in equity of the portfolio is unaffected.<sup>13</sup>

In the following, we first investigate how the different portfolios perform in the climate risk scenario.

### 1 - Current Portfolio

We find an average decline in equity value of around of 4% of total market capitalization, corresponding to USD 1.4bn due to a sudden increase in the carbon price of USD 150 per tonnes CO<sub>2</sub>, see Figure 8.

The loss is mainly driven by the five highly emitting sectors, where changes in equity value are in the range of -24% to -46%. The sector with the highest climate risks is "Utilities - highly emitting," which faces a loss of USD 0.2bn corresponding to 46% of their current market capitalization. However, these high emitting sectors only make up 10% of total market capitalisation, implying that the large changes in equity value do not result in a large change in the equity value of the entire portfolio.

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9: IEA (2021): Net zero by 2050 A Roadmap for the Global Energy Sector, page 101 and 115: [Link](#)

10: See Appendix for a description of the methodology

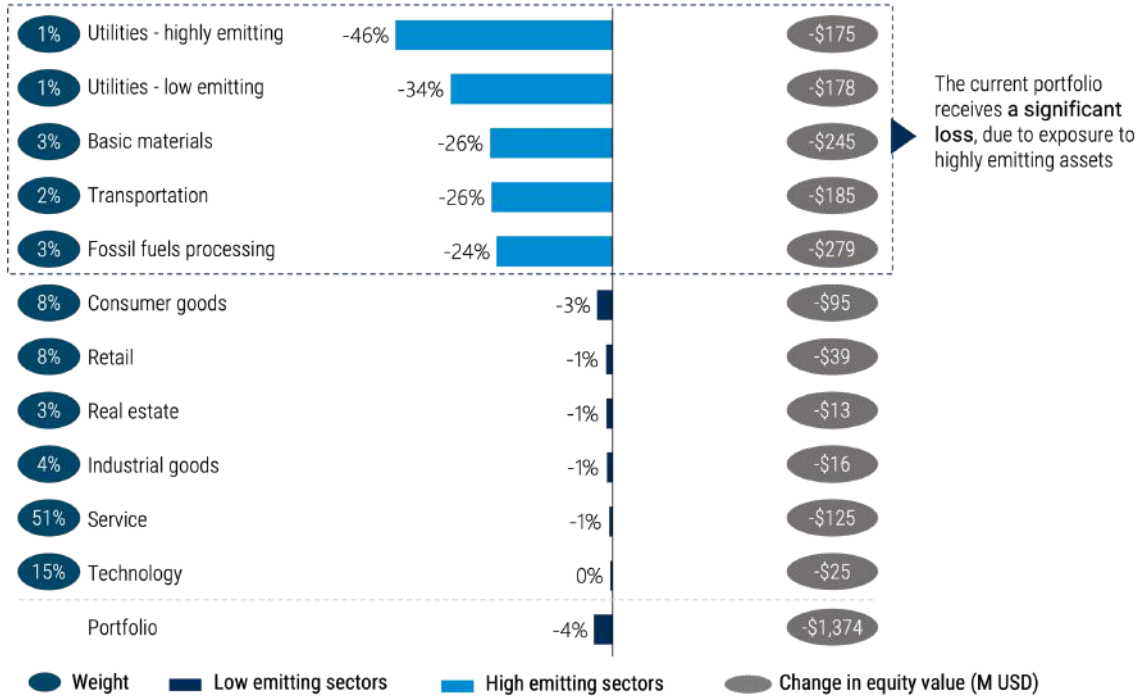
11: Only stocks where emission data is available is a part of the portfolio implying the portfolio consists of 361 stocks

12: Divesting all stocks from the two sectors with the highest emissions per market cap: "Utilities – highly emitting" and "Fossil fuels processing" as well as all stocks with emissions per market cap above 172 M USD per tonnes. This threshold is based on top 15% of stocks with highest number of emissions per market cap.

13: In practice this corresponds to short 100% of top 20<sup>th</sup> emitters and 9% of 21<sup>st</sup> highest emitter.

FIGURE 8

Decline in equity value as a share of market cap for the current portfolio



Note: Based on 361 stocks from the SP500 index

Source: SP500 data from Eikon / IEA: [Link](#)

## 2 - Carbon Divesting Portfolio

Having divested all the high emitters from the portfolio, the impact of the CO<sub>2</sub> price is less than a quarter as large, with a loss of 1% of the market capitalization, corresponding to some USD 0.3bn, see Figure 9.

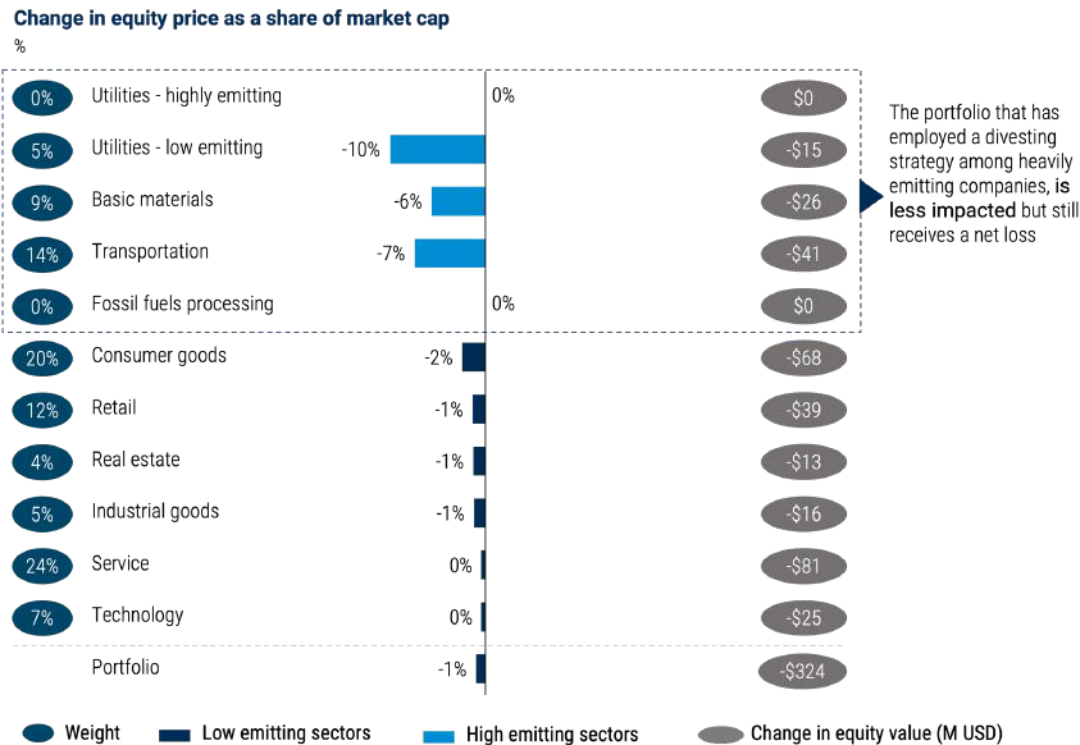
The reduction in lost equity value achieved by divesting all stocks from the two sectors with the highest emissions per market capitalization: "Utilities – highly emitting" and "Fossil fuels processing," as well as top 15% stocks with highest number of emissions per market cap. The vast majority of divestment take place within the high emitting sectors, except for a few within "Consumer goods" and "Service."<sup>14</sup>

The above example demonstrates that divesting can take investors quite far in increasing the robustness towards climate risks – but cannot avoid investors still facing a net loss. To make a portfolio truly neutral to climate risks, we need to hedge via short positions.

14: 65 stocks divested in total, primarily from highly emitting sectors, but also two from consumer goods and three from services

FIGURE 9

Decline in equity value as a share of market cap for the carbon divesting portfolio



Note: Based on 361 stocks from the SP500 index

Source: SP500 data from Eikon / IEA: [Link](#)

### 3 - Climate Risk Neutral Portfolio

In the climate risk neutral portfolio, the strategy is to divest and take short positions in stocks until the gain of the shorted stocks make up for the loss of the other stocks. This is done by shorting the stocks with the highest change in equity value until the change in equity value is zero. In our example, this approximately corresponds to shorting 0.1% of the 22 stocks with highest change in equity value.

All the highly emitting sectors apart from "Utilities – highly emitting" now make a gain from the shorted positions, see Figure 10. This gain is big enough to close the gap of the loss from the other stocks exposed to climate risks. The sector "Utilities – highly emitting" still faces some climate risk, although the change in equity has been reduced significantly from -46% to -2%.

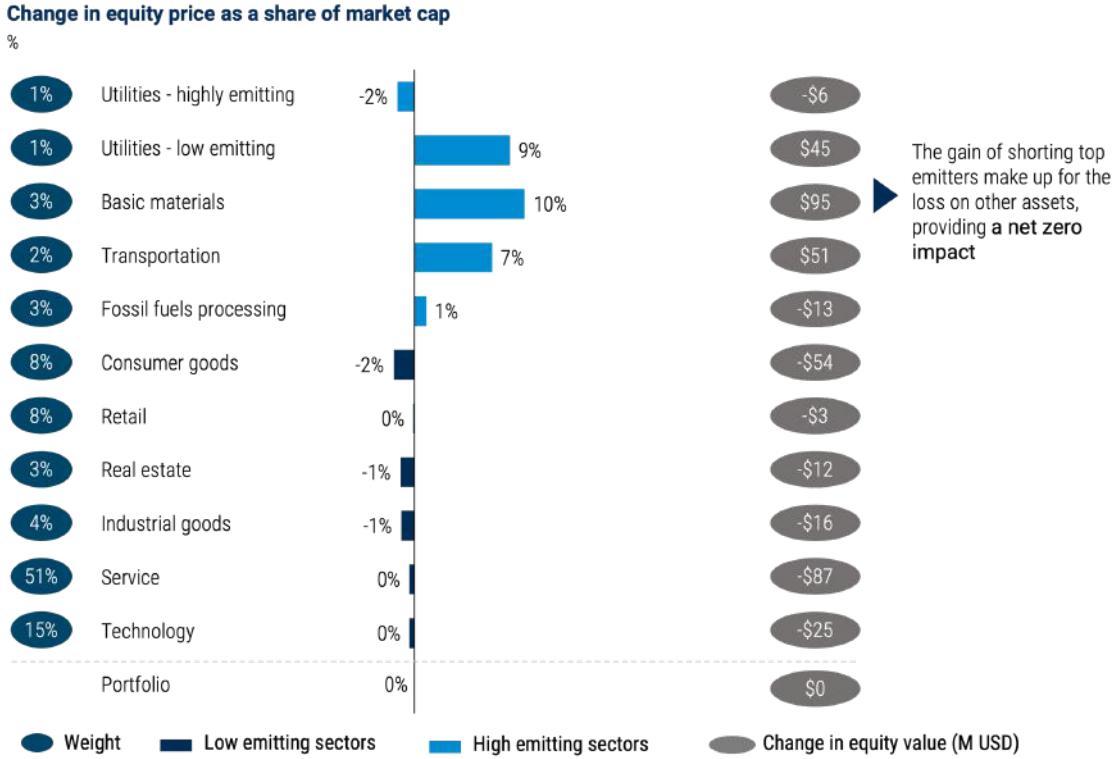
An extension of the climate risk neutral portfolio is one where the investor shorts high emitters to fund buying shares in order to buy more green companies. This could be because the investor has a market neutral mandate, and therefore needs to balance longs against shorts. Just as the additional supply of shares from shorting increases the cost of capital and reduces investment, so too would an increase in demand for shares reduce the cost of capital and stimulate investment. Investors frequently short companies in order to fund their long positions. In other words, one has more money to buy stocks due to the proceeds from shorting other stocks. So would have the effect of funnelling capital investment from more to less polluting sectors. Long and shorts have symmetrical, opposite effects. So, to the extent that climate motivated investors are buying shares in ESG-friendly companies, which will lead to more green capital investments.



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**FIGURE 10**

Decline in equity value as a share of market cap for the climate neutral portfolio



Note: Based on 361 stocks from the SP500 index

Source: SP500 data from Eikon / IEA: [Link](#)

## Conclusion

ESG is an increasingly important focus for investors of all types. Short selling is an important tool by which investors can have a real-world impact and hedge their portfolios from climate and regulatory risks. Short selling can potentially reallocate \$50-\$140 billion of investments away from the most heavily polluting companies. But to fully realize this potential, ESG portfolio metrics cannot ignore short positions or incorrectly treat any exposure, be it long or short, the same.

## Appendix A

### Model of Short Sales and Capital Investment

This appendix describes in detail the assumptions used to model the impact of short positions in carbon-heavy stocks on the capital allocation towards these companies.

The starting point of our analysis is an assumption that when a stock is bought (sold) it tends to push the equilibrium price up (down) even after the equilibrium adjustments of the stock has occurred. While it is intuitive that a buying pressure on a stock tends to drive the price up, such an effect goes against the efficient market hypothesis which assumes no arbitrage opportunities. Here, any upwards pressure will instead be counteracted by arbitrageurs that make a profit (e.g., by shorting the now over-priced stock and going long in the market portfolio). If stock prices are determined by an absence of arbitrage, the stock market is said to be fully efficient, and the price of each stock will always equal the expected net present value (NPV) of dividends. Since the NPV of dividends is unaffected by the market, stock trades do not affect the price in this case.

#### The Stock Demand Elasticity

Since the supply of stocks is fixed (giving a vertical supply curve), it is the slope of the stock demand curve that determines whether demand surges can have an effect on the stock price. While a fully efficient stock market corresponds to a completely flat demand curve, the demand curve will be downward sloping if demand surges can have an effect.

A common explanation for why the demand may be downward sloping lies in the (limited) ability of investors to react to deviations in a stock price from its fundamental value. For instance, 80 percent of the equity in S&P 500 is held by institutional investors<sup>15</sup> who typically operate under an investment mandate that bars them from reacting fully to arbitrage opportunities. An actively managed fund may for instance react to an arbitrage opportunity by increasing the portfolio weight of the stock but not necessarily by accumulating the stock until the arbitrage opportunity has been eliminated.

#### Estimates of Stock Demand Elasticities

Since Scholes (1972), the empirical finance literature has attempted to quantify the slope of the stock demand curve. A common identification strategy relies on changes to stock market benchmark indices such as S&P 500 and Russell 1000/2000. When stocks are included or excluded from these indices, it generates a demand surge or decrease because many funds (in particular passively managed index funds) operate under a mandate where their holding of a stock depends on whether the stock is included in an index or not.

Our model uses a demand elasticity that is based on the estimates in the empirical literature (See Table 1). The estimates vary in magnitude between papers from -0.2 to -3000. A numerically small elasticity implies that flows in and out of stocks have a large price effect while numerically large elasticities imply a small price effect.

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15: 80% of equity market cap held by institutions | Pensions & Investments ([pionline.com](http://pionline.com))  
<https://www.oecd.org/corporate/Owners-of-the-Worlds-Listed-Companies.pdf>

## Appendix A

We base our modelling on the estimate of -1.5 in Yen-Chen Chang, Harrison Hong & Inessa Liskovich (Review of Financial Studies, 2015). The paper uses the Russell 1000 and 2000 stock indices which comprise the first 1000 and next 2000 largest firms ranked by market capitalization. Only small changes determine whether firms around a market cap cut-off belongs to one or the other index. Since the indices are value weighted, more money tracks the top firms in Russell 2000 than the bottom firms in Russell 1000. Therefore, a firm entering the Russell 2000 will experience a surge in stock demand. This study design addresses several issues with traditional index inclusion designs which usually measure the effect of stocks that get included into an index, and where it can be hard to separate the index inclusion from confounders such as investor news and investor recognition associated with S&P 500 membership.

An alternative estimate that doesn't use index inclusion is found in Kaul, Mehrotra & Morck (2000, Journal of Finance) which uses a re-weighting of the Toronto Stock Exchange's benchmark index and finds an elasticity of -10.5. A more recent study that uses a novel instrumental variable technique to estimate the effect of the funds flow into ESG investing finds that for every dollar moved from the general market portfolio into ESG funds, the ESG indices increase by \$2 indicating an elasticity of -0.5. This estimate is in line with Gabaix & Koijen (2021) which finds that a dollar moved from bonds into the stock market increases stock prices by \$5.

These papers suggest a larger price effect of shorting than the -1.5 demand elasticity estimate that we use. However, this is expected since they are based on more aggregate flows between funds. In general, demand curves for individual stocks, such as the top 16 emitters, will be more elastic since individual stocks are more substitutable than the general stock market.

**TABLE 1**

Elasticity estimates

Article	Elasticity Estimate	Sample
Gabaix & Koijen (2021)	-0.2	Elasticity based on flow from bonds into the general stock market
Van der Beek (2021)	-0.5	Based on an analysis of the recent flow into ESG funds
Yen-Cheng Chang, Harrison Hong, Inessa Liskovich	-1.5	Regression Discontinuity and the Price Effects of Stock Market Indexing (RFS, 2015)
Kaul, Mehrotra, and Morck (2000)	-10	
Scholes (1972)	-3000	345 secondary distributions of large blocks on NYSE between 1961 and 1965
Schlerifer (1986, inferred)	-1	246 additions to the S&P 500 between 1976 and 1983
Loderer, Cooney and Van Drunen	-11.12 (mean)	409 announcements of equity issues by regulated firms between 1969 and 1982
Loderer, Cooney and Van Drunen	-4.31 (median)	
Bagwell (1992, p. 97)	-1.65	31 Dutch auctions repurchases between 1981 and 1988
Kandel, Sarig and Wohl (1999, p. 235)	-37.2 (mean)	27 Israeli IPO auctions between 1993 and 1996
Kaul, Mehrotra and Morck (2000, p. 911)	-21 (median)	
	-10.5	292 stocks affected by Toronto Stock Exchange 300 index weights change effective November 1996
Jeffrey Wurgler and Ekaterina Zhuravskaya	-11.72 (at twenty-fifth percentile arbitrage risk)	177 additions to the S&P 500 between 1976 and 1989
Jeffrey Wurgler and Ekaterina Zhuravskaya	-8.24 (at median arbitrage risk)	
Jeffrey Wurgler and Ekaterina Zhuravskaya	-5.57 (at seventy-fifth percentile arbitrage risk)	

# Appendix A

## The Effect of Shorting on Stock Prices

Our modeling focuses on the effect of placing short positions in the top 16 emitting companies in S&P 500. Here, we will quantify the effect of short interest on market cap in two scenarios:

- **Scenario 1:** Evaluating the effect on WACC and total assets of the current level of short interest in each asset compared to a situation of each asset having zero short interest.
- **Scenario 2:** Evaluating the effect on WACC and total assets of shorting the asset up to the maximum possible level of short interest which we assume to be 10 percent.

Using the existing level of short interest as well as our assumed demand elasticity, we can use it to compute the effect on the stock price where we use the following formula.

$$market\ cap = market\ cap\ old * (1 - \frac{1}{\gamma} \Delta Short\ Interest)$$

Where  $\Delta Short\ Interest$  is the change in short interest in each scenario (positive changes indicating an increase in short interest) and  $\gamma$  denoting the demand elasticity.

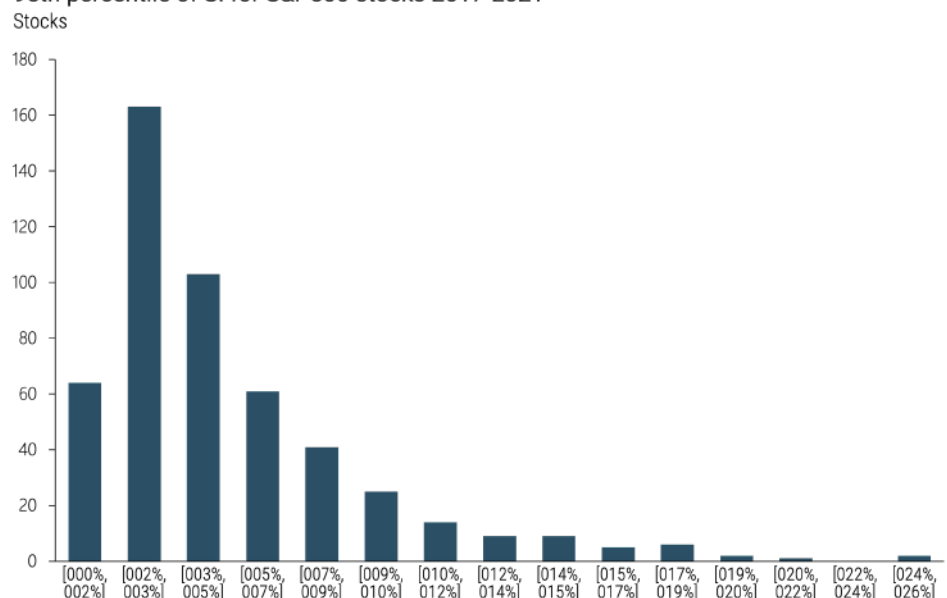
We justify using a maximum short interest level of 10% by studying the historical levels of short interest in the stocks in S&P 500 (see Figure 11). For each stock, we compute the 95th percentile of the short interest for the period 2017-2021 as an indicator of the maximum possible level of short interest in each stock. Across all the stocks we find that about 90% of the stocks have a maximum below 10%, so that 10% short interest corresponds approximately to the 90th percentile. We therefore use this as a benchmark for our modelling assumption.

**FIGURE 11**

Note: The figure is based on the 95<sup>th</sup> percentile of SI for each company in S&P 500. While the histogram approximates the empirical density, the light blue line shows the empirical cumulative distribution function.

Source: Computations by Copenhagen Economics based on data from Eikon

**95th percentile of SI for S&P500 stocks 2017-2021**

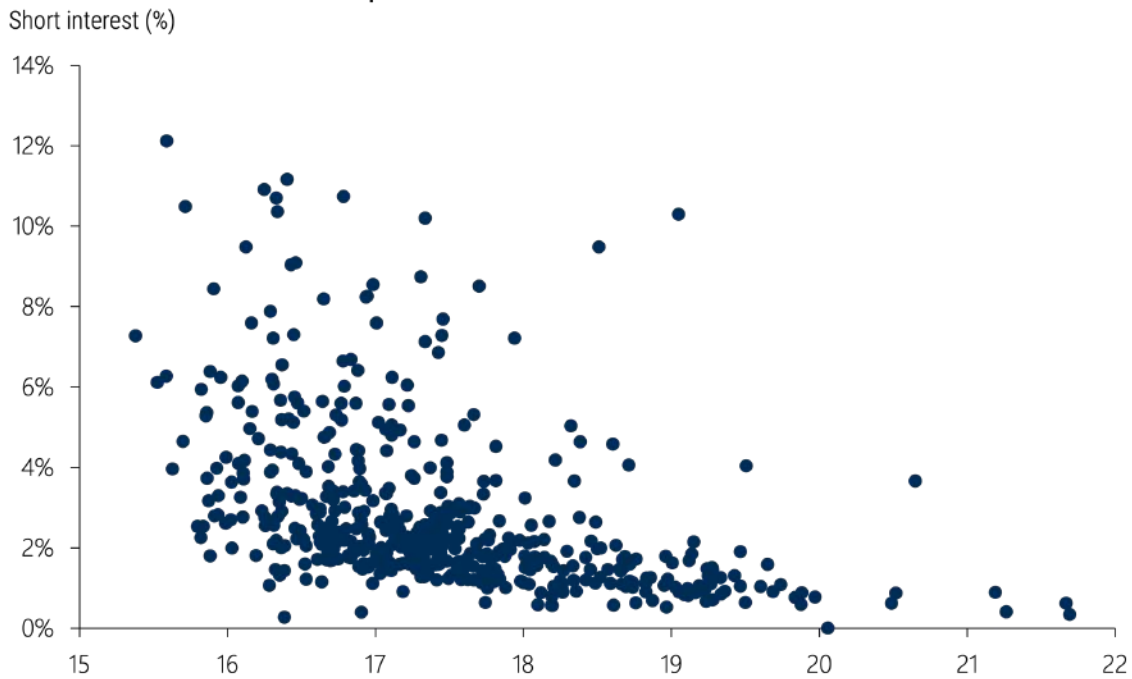


# Appendix A

We can justify that a maximum exists for each stock by e.g., studying the relation between short interest and market cap, see Figure 12. The negative correlation is visually clear suggesting that short sellers face a capacity constraint in how much they can short, making it more difficult to achieve high levels of short interest in large stocks.

**FIGURE 12**

### Short interest and market cap



Note: The Short Interest (%) is measured as the 95<sup>th</sup> percentile in short interest of each stock between 2017-2021. The Log(Market Cap) is the natural logarithm of the ultimo 2019 market cap of each company.

Source: Eikon

# Appendix A

## Computing the Change in WACC

Having computed the change in market capitalization, we can proceed to compute the change in the companies' cost of capital (WACC) which ultimately governs the corporate investment decisions. The WACC consists of two components: the cost of debt and the cost of equity. We make the assumption that flows in and out of the stock only affect the cost of equity  $r^e$ . We compute the new cost of equity in the following way:

$$r^{e(new)} = r^{e(old)} \cdot \frac{\text{Market Cap New}}{\text{Market Cap Old}}$$

The new WACC can then be computed as:

$$WACC = \alpha \cdot r^{e(new)} + (1 - \alpha)r^D$$

Where  $R^D$  is the cost of debt for the company and  $\alpha$  is the share of equity funding. To get base levels of the WACC from which we can compute changes, we use data from the Damodaran database (see Box 1).

### Box 1 WACC

The WACC is the direct financing cost for firms and measures that marginal cost of making further investments in a company. We focus on the top 16 emitters in the S&P 500. 10 of these companies belong to the utilities sector, 3 to the energy sector, and the rest to Industrials and Basic Materials. We pull Cost of Equity, Cost of Debt, Share of Equity funding and WACC estimates for these relevant industries from the Damodaran Database (see Table). Based on these estimates, we use median values on Cost of Equity and Debt to compute the share of

	Cost of Equity	Cost of Debt	E/(D+E)	D/(D+E)	WACC
Coal & Related Energy	4,84%	2,19%	51,38%	48,62%	3,55%
Oil/Gas (Integrated)	6,88%	1,88%	69,40%	30,60%	5,35%
Oil/Gas (Production and Exploration)	6,52%	2,19%	58,11%	41,89%	4,70%
Oil/Gas Distribution	6,39%	2,19%	43,54%	56,46%	4,02%
Utility (General)	4,42%	1,40%	57,24%	42,76%	3,13%
Utility (Water)	5,55%	2,19%	79,93%	20,07%	4,87%

Source: We pull the GICS sector for the Top 16 emitting companies from Refinitiv Eikon. Sector averages based on the Damodaran Database: [Link](#)

# Appendix A

## The Capital Allocation Elasticity

The increase in the cost of capital (WACC) shown in the methodology above leads to a decrease in the capital stock.

We calculate the impact using two different methodologies:

**Methodology 1:** using our structural macro-economic model.<sup>16</sup>

**Methodology 2:** using elasticity from Cobb-Douglas production function from European Commission study.<sup>17</sup>

### Main Approach: Using our Structural Macro-Economic Model

To estimate the macroeconomic costs (i.e., the impact on GDP and investments), we use a model developed by Meh and Moran (2010). It is a so-called Dynamic Stochastic General Equilibrium (DSGE) model, which is a structural macroeconomic model. The model is calibrated to recent European financial sector data, and we used a DSGE model to measure the impact of the simulated financial friction on capital requirements and thus on GDP. For a more thorough description of the model, see: Copenhagen Economics (2019) 'EU Implementation of The Final Basel III Framework'.

### Calculate the Impact on Capital Stock from an Increase in Cost of Capital:

In the model, we introduce financial frictions on the capital markets to create monetary costs of credit provisions. This experiment somewhat resembles the introduction of a financial tax, making it suitable for our purpose.

Based on this experiment, we can estimate an elasticity on the capital stock from increasing capital costs. Specifically, we find that an increase in funding costs of just over 0.6% leads to a decrease in the capital stock of 1.5% (i.e., an elasticity of around 2.5).

### Alternative Approach: Using Elasticity from Cobb-Douglas Production Function

A European Commission study has derived a Cobb-Douglas production function that gives a direct relationship between the cost of capital and capital  $K$  using this derived formula  $K^* = (1-\alpha) + Y - cc$ .<sup>18</sup>

This shows that the elasticity of capital stock with respect to the cost of capital is -1, which means an increase of 1% in the cost of capital will reduce the capital stock by 1%. This means the increase in the WACC of 0.6% will lead to a decrease in capital of 0.6%. Using the relationship between capital and GDP of 1/3 which we used above, this will lead to a decrease in GDP in the EU-27 of 0.2%.

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16: Described in detail in Copenhagen Economics (2019), EU Implementation of the Final Basel III Framework

17: European Commission (2009), The Economic Impact of the Commission Recommendation on Withholding Tax

18: European Commission (2009), The Economic Impact of the Commission Recommendation on Withholding Tax Relief Procedure and the FISCO Proposals page 53

# Appendix B

## Different Sectors' Exposure to Climate Risks

**Figure 13**

Sector Definitions

Source: Copenhagen Economics based on data from Eikon

	Sector category	Description
Portfolio: SP500 <sup>3</sup>	Consumer goods	Non-cyclical and cyclical consumer goods
	Basic materials	Minerals sources, chemicals, and applied resources
	Fossil fuels processing	Oil & gas exploration, production, equipment, refining, marketing, transport and related services
	Industrial goods	Aerospace, Defence, Heavy machinery and vehicles, industrial equipment
	Real estate	Real estate operations, residential and commercial REITs <sup>1</sup>
	Retail	Retailers, Food & drug retailing
	Service	Industrial & commercial, Software & IT, Consumer, Telecom, Insurance, Banking & Investment, Healthcare services
	Technology	Technology Equipment, FinTech & Infrastructure
	Transportation	Ground freight & logistics, Airlines, Courier, Postal, Air Freight & Land-based Logistics
	Utilities – highly emitting <sup>2</sup>	Electrics and Multiline utilities
	Utilities – low emitting <sup>2</sup>	Electrics, Natural gas, Water and Multiline utilities, Renewable energy equipment & services

## Shorting as a Hedging Tool Against Climate Risks: A Numerical Example

In this part of the appendix, we describe methodology behind the numerical example of how shorting carbon-heavy stocks is useful as a tool for hedging.

To illustrate how short selling of carbon-heavy stocks can be used as a hedging tool for climate risks, we construct three numerical examples:

1. Current portfolio: Portfolio with long positions in 361 stocks from SP500 index where emission data are available.
2. Carbon divesting portfolio: Divesting carbon-heavy stocks.
3. Climate risk neutral portfolio: Shorting carbon-heavy stocks until portfolio reach net zero climate risk.



## Appendix B

In these three cases, we illustrate how a change in carbon price affects equity value of different stocks. We consider stocks from the SP 500 index, which we divide into 11 sectors. For each of the three cases, we calculate the change in equity value as consequence of carbon price of 150 USD per ton CO<sub>2</sub>. This is done by computing the net present value of the cost of emissions from today until infinity. This calculation consists of three steps:

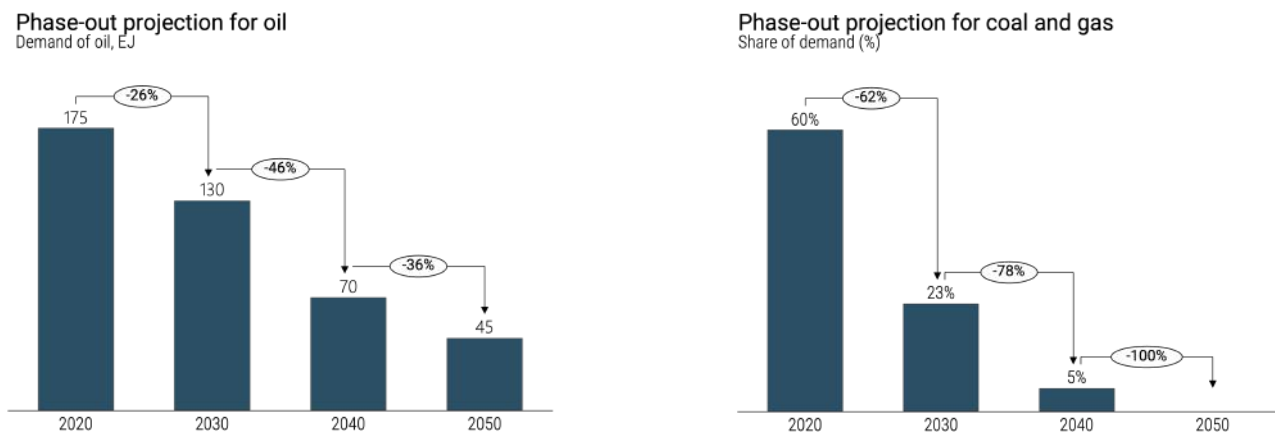
1. Use the emissions data from 2021 and make linear depreciation of the emissions going to 20% of 2021 value in 2050 for each stock and assume this level continues forever after this.
2. Calculate the cost of emissions for each year per stock.
3. Take the net present value of the cost for all the stocks.

To allow for different carbon price sensitives, we apply another method to compute change in equity for the two sectors “Utilities – highly emitting” and “Fossil fuel processing”. This calculation is based on three steps:

1. Extrapolate the return on equity from 2021 to 2050 based on net zero projections of demand, see Figure 14.
2. Find the net present value of the return on equity, which represent the new market cap of the company.
3. Computing the change between the market cap and the old market cap.

**FIGURE 14**

Phase-out projection for oil, gas, and coal



Source: IEA (2021): Net zero by 2050 A Roadmap for the Global Energy Sector: [Link](#)

Based on this, we compute the change in equity value as a share of market cap per sector in each of the three cases: where the current portfolio is exposed to substantial amount of risk, the carbon divesting portfolio some of the risk is reduced due to the divestments, and for the climate neutral risk portfolio the risk is eliminated due to the upside from the short positions.

We assume that the investors hold 0.1% of the portfolio, a discount rate of 10%, and that the company does not pass-through the extra cost of emissions to consumer (i.e., they will not set a higher price for the buyer of their product and thereby offset the cost).