

# Climate scenarios and carbon neutrality: the investors/companies nexus

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May 17, 2024



# Agenda

- 1 Context: climate scenarios and transition plans
- 2 Motivations: low-carbon targets and financial risk
- 3 Model: alignment strategies and returns to ability
- 4 Market equilibrium and empirical identification of a climate risk premium
- 5 Conclusion

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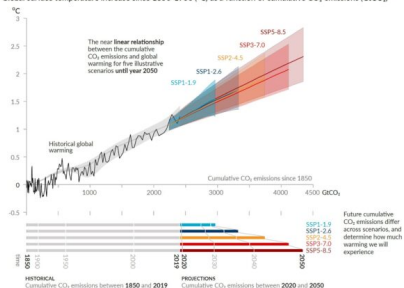
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# Climate scenarios

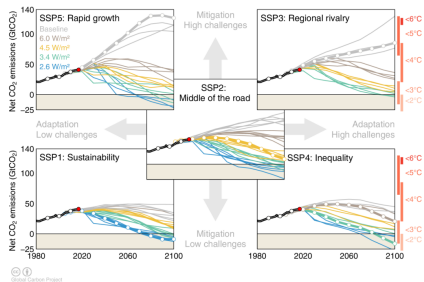
- In its simplest form: projection of anthropogenic carbon emissions over a period of time: **carbon budget**.
- More sophisticated models (such as Shared Socio-economic Pathways, IPCC): addition of socio-economic parameters.

## Every tonne of CO<sub>2</sub> emissions adds to global warming

Global surface temperature increase since 1850-1900 (°C) as a function of cumulative CO<sub>2</sub> emissions (GtCO<sub>2</sub>)



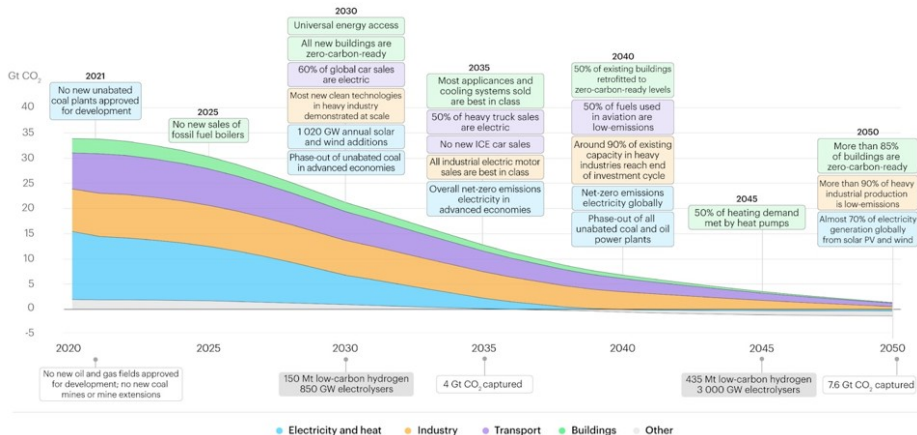
## Carbon budgets, IPCC



## Shared Socio-economic Pathways, IPCC & Global Carbon Project

# Global carbon neutrality by 2050

- Reaching net zero emissions globally (carbon neutrality) by 2050 means that global warming is limited to less than 2°C, with emissions being halved by 2030.



Net Zero Scenario, *International Energy Agency*

# Status of Net Zero targets in 2022

- Since 2015, **91% of the world's GDP** is covered by Net Zero pledges: 83% of the world's GHG emissions (Net Zero Tracker, 2022).
- At the subnational level, most Net Zero targets come from **high-income countries**.
- 58% of **companies headquartered in Europe** have Net Zero targets, a figure much higher than companies with American (36%) or Asian (20%) headquarters.

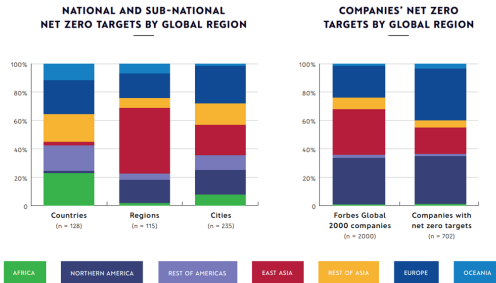
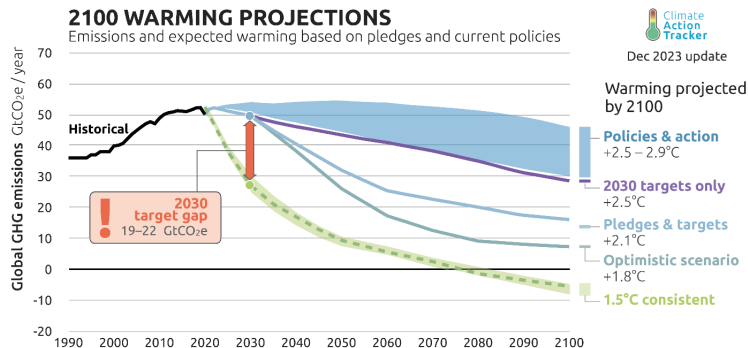


Figure 2: Breakdown of net zero targets by UN region classification for national and sub-national governments (left panel) and for companies (right panel). For companies, the breakdown of all Forbes 2000-listed companies by their headquarters location is also presented for comparison.

Source: Net Zero Tracker

# Status of Net Zero targets in 2022

- Net Zero pledges more robust and credible, but insufficient to keep global warming below 2°C (Boehm et al., 2023).
- Medium-term targets are the least ambitious.
- Policies and actions could lead to a global warming of +3°C by the end of the century.



Source: Climate Action Tracker

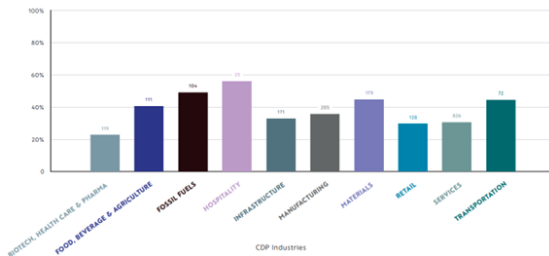
## Low-carbon targets of companies

- Third-party verification platforms (Science-Based Targets initiative, ACT) have become very popular for the credibility of the targets.

### The credibility of a low-carbon target: '4P' criteria

- **Pledge**: publicly declared, specific timeline with interim targets.
- **Plan**: existence of clear plans with concrete operational ramifications.
- **Proceed**: immediate action once the pledge is published.
- **Publish**: progress reports should be frequent and publicly available.

COMPANIES: NET ZERO TARGETS BY SECTOR



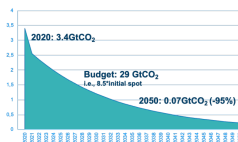
Source: Net Zero Tracker



# Aligning a portfolio to Net Zero

- Financial portfolios can also align with metrics such as Implied Temperature Ratings.
- The Alignment Cookbook (Raynaud et al., 2020): methodology for translating global scenarios into alignment metrics.
- More straightforward approach: a carbon budget becomes a constraint for the allocation of assets (Bolton, Kacperczyk, and Samama, 2022).

Figure 2: Carbon emissions reduction that mimics the required path to achieve carbon neutrality by 2050 on MSCI Europe



Assumptions: 25% initial haircut followed by an 8% geometric reduction; emissions are constant

*Bolton, Kacperczyk, and Samama, 2022*

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# Motivations

- The alignment strategy of a company an important issue when the current objective is to accelerate the transition.
- Existing theoretical models have not modeled the impact of committing to a low-carbon target on stock prices.

## Asset prices equilibrium

Low-carbon targets of companies and investor preferences: **how can more companies commit to low-carbon strategies?**

## Climate risk of alignment strategies

Existence of a climate risk premium: **is there a lower financial risk when a company commits to a low-carbon target?**

## Alignment strategies and portfolio allocation

- We bring a theoretical and empirical contribution to the literature on low-carbon targets for companies and investors.

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- We start by formalizing a low-carbon scenario with a carbon budget.
- We apply the concepts of climate scenario and alignment to an economic model in two phases:
  - In the first phase, firms must take a strategic decision on aligning to a low-carbon scenario. We introduce the concept of **decarbonization ability** as a key parameter in the firms' decisions.
  - In a second phase, after targets are publicly announced, investors make their portfolio allocations based on the firms' decisions, which are translated into a climate risk premium.

# Alignment strategies and portfolio allocation

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  - In a second phase, after targets are publicly announced, investors make their portfolio allocations based on the firms' decisions, which are translated into a climate risk premium.
- We also empirically illustrate the existence of a climate risk premium for firms that do not commit to a low-carbon target within certain industrial sectors.

## Existing literature

- Committing to a low-carbon target serves different objectives: lowering impact on climate change, to increase customer demand, and to attract investors: Flammer, 2012; Chen, Kumar, and Zhang, 2019; Bolton and Kacperczyk, 2021.
- For an investor, a firm's commitment is a long-term indicator of its financial risk Slawinski et al., 2017.
- Multi-stakeholder initiatives (SBTi, ACT, Climate Action 100+), play an important role in accelerating the commitment of firms to low-carbon targets.
- Several theoretical models use utility functions integrating climate preferences: Pástor, Stambaugh, and Taylor, 2021; Pedersen, Fitzgibbons, and Pomorski, 2021; Avramov et al., 2022; Zerbib, 2022.



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## Climate scenarios using carbon budgets

- Climate scenario (low-carbon pathway): for a carbon budget, we determine a decarbonization rate.

$$\int_0^{\infty} E_t \, dt = \int_0^{\infty} E_0(1 - \tau)^t \, dt = C \quad (1)$$

$E_t, E_{t=0}$ : global emissions at  $t$  and at  $t = 0$

$C$ : global carbon budget

$\tau$ : decarbonization rate

- We define a reference pathway, the benchmark target, compatible with a well below 2°C carbon budget  $C$  with a **benchmark decarbonization rate  $\tau_B$** :

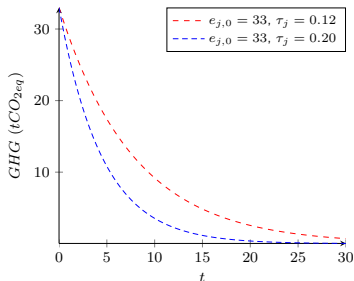
### Definition (*Benchmark low-carbon target*)

Cumulative emissions must be equal to the carbon budget:

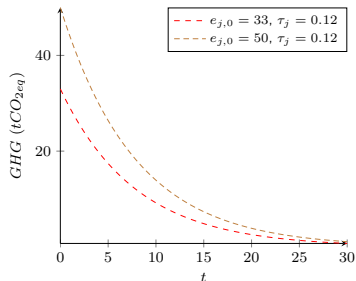
$$\sum_{j=1}^M \sum_{t=0}^T e_{j,0} \cdot (1 - \tau_B)^t = C$$

# Example of decarbonization pathway

(a) Heterogeneous efforts with the same initial level of emissions



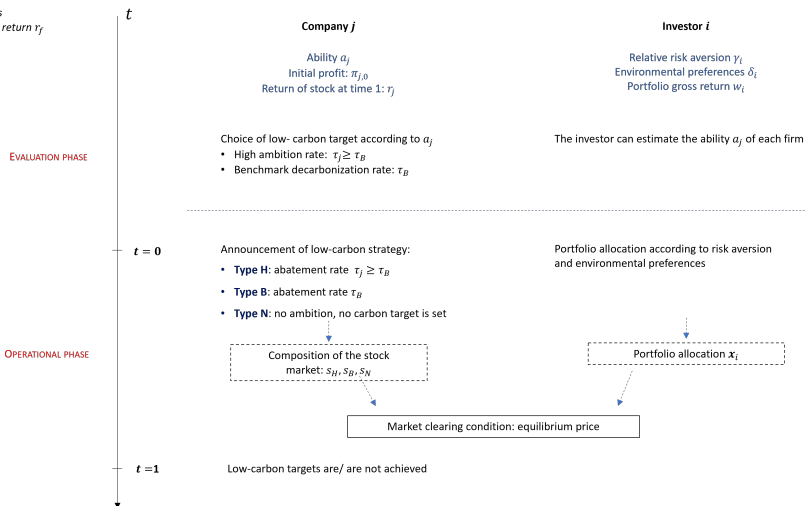
(b) Homogeneous efforts with heterogeneous levels of initial emissions



Examples of low-carbon pathways

# Model outline

*M* public companies  
Risk free asset with return  $r_f$   
Carbon budget  $C$



## Decarbonization ability

- We introduce the concept of **decarbonization ability**, labeled  $a_j$  for firm  $j$ : companies' capacities to abate their emissions.
- In practise, it is an endogenous variable with an underlying set of characteristics: climate governance, green CAPEX, level of emissions, competition, etc.
- Companies should be evaluated on the trajectory of their emissions and on the credibility of achieving the low-carbon targets they set.

## Evaluation phase: selecting a target

- Objective of firms: increase their value (Robert, 2023) by **maximizing expected revenue** (Cornell and Damodaran, 2020):

$$E[\pi_{1,j}] = \begin{cases} \pi_{0,j}(1 + g_j + \lambda_j \tau_B) & \text{for type B} \\ \pi_{0,j}(1 + g_j + \lambda_j \tau_j) & \text{for type H} \\ \pi_{0,j}(1 + g_N) & \text{for type N} \end{cases}$$

$$\lambda_j = \begin{cases} \lambda (1 - \tau_B) & \text{for type B} \\ \lambda & \text{for type H} \end{cases}$$

$\pi_{0,j}, \pi_{1,j}$ : profits of company  $j$  at  $t = 0, 1$

$g_j$ : profit growth rate of company  $j$

$g_N$ : profit growth rate of a type N company

$\lambda \in ]0, 1]$ : constant probability for a type H company to achieve its target

- The decarbonization rate of a type H company depends on its ability:

$$\tau_j = (a_j + \kappa)^2 \quad \text{with } \kappa \in ]0, 1[$$

## Evaluation phase: when a firm commits

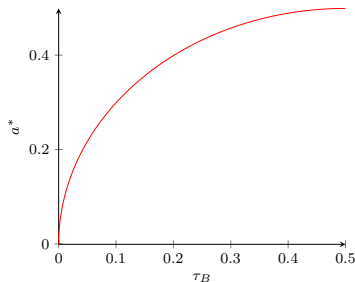
When firm  $j$  decides to commit, it will choose to be of type H if:

$$\pi_{0,j}(1 + g_j + \lambda (a_j + \kappa)^2) \geq \pi_{0,j}(1 + g_j + \lambda \tau_B (1 - \tau_B))$$

### Definition

We define the **decarbonization ability threshold**  $a^*$ :

$$a^* = -\kappa + \sqrt{\tau_B (1 - \tau_B)}$$



Benchmark decarbonization rate constraint on ability of firms ( $\kappa = 0.001$ )

## Evaluation phase: composition of the stock market

- The indifference condition between being a type B or a type N company is:

$$g_N = g_j + \lambda \tau_B (1 - \tau_B)$$

- For a firm with high abilities, we assume there is always an incentive to announce a low-carbon target:

### Assumption

For firm  $j$ , if  $a_j > a^*$  then  $g_j > g_N - \lambda \tau_B (1 - \tau_B)$ .

- Market distribution:

$$\begin{cases} s_B + s_N = a^* \\ s_H = 1 - a^* \end{cases} \quad (2)$$



# Portfolio allocation: risk aversion and climate preference

- At the beginning of the operational phase:
  - Low-carbon target announcement by firms.
  - Allocation of investor  $i$ , with relative risk aversion  $\gamma_i$  and climate preferences  $\delta_i$ .
- The allocation decision is made by maximizing expected utility (Pástor, Stambaugh, and Taylor, 2021; Avramov et al., 2022):

$$U(w_i, \mathbf{x}_i) = -e^{-\gamma_i w_i - \frac{\delta_i}{\tau_B} \mathbf{x}_i' \boldsymbol{\tau}} \quad (3)$$

- The gross return of the portfolio depends on returns from the risk-free and risky assets :

$$w_i = (1 + r_f + \mathbf{x}_i' \mathbf{r})$$

$w_i$ : gross return of the portfolio at  $t = 1$

$\boldsymbol{\tau}$ : vector of the decarbonization rates

$\mathbf{x}_i = (x_{i,1}, \dots, x_{i,M})$ : vector of portfolio weights

$\mathbf{r} = (r_1, \dots, r_M)'$ : vector of portfolio returns

# Climate risk premium

- We assume that the return of an asset  $r_j$  has a CAPM + climate risk premium structure (Sharpe, 1964; Pástor, Stambaugh, and Taylor, 2021):

$$r_j = \beta_{mkt,j} r_{mkt} + \tilde{r}_j + \epsilon_j = r_{j,capm} + \tilde{r}_j + \epsilon_j \quad (4)$$

$$\tilde{r}_j = \begin{cases} (1 - \lambda(1 - \tau_B)) \tilde{r}_B & \text{for type B companies} \\ (1 - \lambda) \tilde{r}_H & \text{for type H companies} \\ \tilde{r}_N & \text{for type N companies} \end{cases}$$

$\beta_{mkt,j}$ : sensitivity of asset  $j$  to the market return  $r_{mkt}$

$\tilde{r}_j$ : climate risk premium

$\epsilon_j \sim \mathcal{N}(0, \sigma_j^2)$  where  $\sigma_j^2$  is the variance of  $j$

# Investor demand

After maximizing the expected utility of investor  $i$ , we have the following demand for type B, H and N stocks:

$$\mathbf{x}_i = \frac{1}{\gamma} \mathbf{\Sigma}^{-1} (\mathbf{r}_{capm} + \tilde{\mathbf{r}} + \frac{\delta_i}{\gamma \tau_B} \boldsymbol{\tau}) \quad (5)$$

$\mathbf{\Sigma}$ : covariance matrix of stock returns.

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## General market equilibrium

- The distribution of the stock market  $\mathbf{s} = (s_B, s_H, s_N)$  and the investors' portfolio allocation provide a general market equilibrium:

$$\mathbf{s} = \frac{1}{\gamma} \boldsymbol{\Sigma}^{-1} (\tilde{\mathbf{r}} + \mathbf{r}_{capm} + \frac{\bar{\delta}}{\bar{\gamma}} \boldsymbol{\tau}_B) \quad (6)$$

- A positive average demand from investors  $\bar{\delta}$  reduces the climate risk premium for type B and type H firms.
- The general market equilibrium is very close in its form to Pástor, Stambaugh, and Taylor, 2021.
- We study the market equilibrium in 2 cases:
  - With 2 stocks in the economy, a type B and a type N.
  - With 3 stocks: a type B, a type H and a type N.

## Economy with 2 stocks: type B and type N

- We first reduce the economy to two independent stocks: a type B and a type N, with:

$$s_B + s_N = 1 \quad \text{and} \quad \Sigma = \text{diag}(\sigma_B^2, \sigma_N^2)$$

### Assumption

All investors have an identical positive climate preference:  $\delta > 0$  and a uniform risk aversion  $\gamma$ .

### Assumption

Investors' portfolio allocation depends solely on diversifiable risk.

- Under these hypotheses, the market-clearing condition yields:

$$\mathbf{s} = \frac{1}{\gamma} \Sigma^{-1} \left( \tilde{\mathbf{r}} + \frac{\delta}{\gamma} \boldsymbol{\tau} \right) \quad (7)$$

# Economy with 2 stocks: strategies of firms and risk premia

Market equilibrium for each stock:

$$s_B = \frac{1}{\gamma \sigma_B^2} (1 - \lambda(1 - \tau_B)) \tilde{r}_B + \frac{1}{\gamma \sigma_B^2} \frac{\delta}{\gamma}$$

$$s_N = 1 - s_B = \frac{1}{\gamma \sigma_N^2} \tilde{r}_N$$

In order to determine the supply and risk premia of each stock, we assume that the climate risk premium of the type B stock will be lower than the premium of the type N stock:

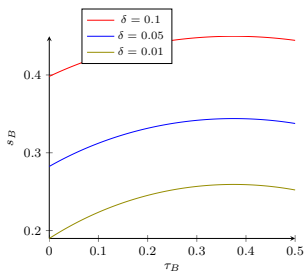
$$\tilde{r}_B = (1 - \tau_B) \tilde{r}_N$$

## Economy with 2 stocks: supply of stocks

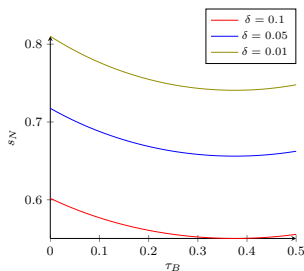
$$s_B = \frac{\frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B) + \frac{\delta}{\sigma_B^2 \gamma^2}}{1 + \frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B)} = 1 - s_N \quad (8)$$

Numerical application:  $\gamma = 3$ ,  $\sigma_B = \sigma_N = 0.2$ ,  $\lambda = 0.8$

(a) Type B



(b) Type N



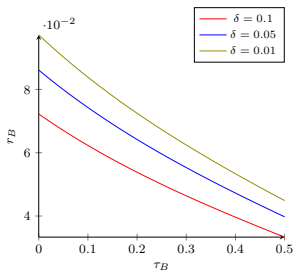
Number of type B and type N stocks in an economy with 2 companies.



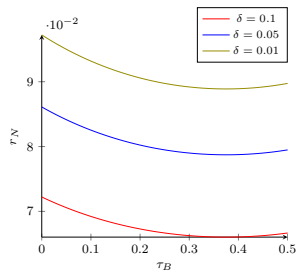
# Economy with 2 stocks: climate risk premium of stocks

- For the type B stock, the climate risk premium is the cost if the company fails to fulfill its target.
- For the type N stock, the climate risk premium serves as an incentive to attract investors.

(a) Type B



(b) Type N



Climate risk factor for type B and type N stocks in an economy with 2 companies.

## Economy with 3 stocks: type B, H and N

- We extend our model by adding a company that has high abilities, with the following supply of stocks:

$$\begin{aligned}s_H &= 1 - a^* \\ s_B + s_N &= a^*\end{aligned}$$

- Market-clearing conditions:

$$\begin{aligned}s_B &= \frac{1}{\gamma \sigma_B^2} (1 - \lambda(1 - \tau_B)) \tilde{r}_B + \frac{\delta}{\gamma^2 \sigma_B^2} \\ s_H = 1 - a^* &= \frac{1}{\gamma \sigma_H^2} (1 - \lambda) \tilde{r}_H + \frac{\delta}{\gamma^2 \sigma_H^2} \frac{\tau_H}{\tau_B} \\ s_N &= \frac{\tilde{r}_N}{\gamma \sigma_N^2}\end{aligned}\tag{9}$$

- We keep the same assumption:  $\tilde{r}_B = (1 - \tau_B) \tilde{r}_N$ .

## Economy with 3 stocks: supply of stocks

- Introducing a type H company in the model has an impact on the number of type N stocks.
- The climate preferences of investors are a determining factor in optimizing the number of stocks that commit to low-carbon targets.

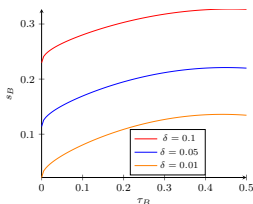
$$s_B = \frac{\frac{\sigma_B^2}{\sigma_N^2} a^* (1 - \lambda(1 - \tau_B)) (1 - \tau_B) + \frac{\delta}{\sigma_B^2 \gamma^2}}{1 + \frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B)} \quad (10)$$

$$s_H = 1 - a^* \quad (11)$$

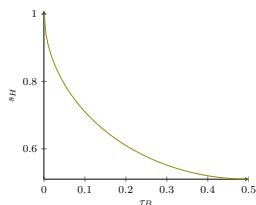
$$s_N = a^* - s_B = \frac{a^* - \frac{\delta}{\sigma_B^2 \gamma^2}}{1 + \frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B)} \quad (12)$$

# Economy with 3 stocks: supply of stocks

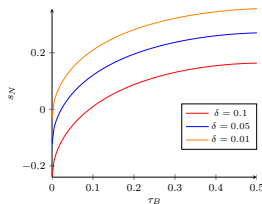
(a) Type B



(b) Type H



(c) Type N



Number of type B, type H and type N stocks in an economy with 3 companies.

## Economy with 3 stocks: climate risk premium

- The risk premium decreases when the company takes an ambitious target.
- The type N risk premium is an increasing function of  $\tau_B$ : the company faces greater exposure to reputational and transition risk if there is climate urgency.

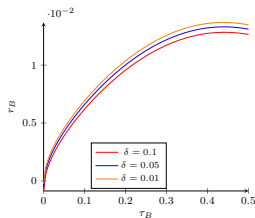
$$\tilde{r}_H = \frac{\gamma \sigma_H^2 (1 - a^*) - \frac{\delta}{\gamma} \frac{\tau_H}{\tau_B}}{1 - \lambda} \quad (13)$$

$$\tilde{r}_N = \frac{\gamma \sigma_N^2 a^* - \frac{\delta}{\gamma}}{1 + \frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B)} \quad (14)$$

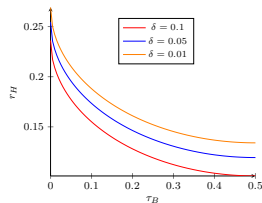
$$\tilde{r}_B = (1 - \tau_B) \tilde{r}_N \quad (15)$$

## Economy with 3 stocks: climate risk premium

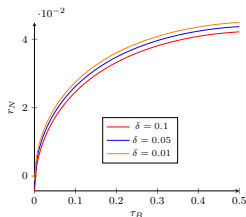
(a) Type B



(b) Type H



(c) Type N



Climate risk factor for type B, type H and type N stocks in an economy with 3 companies.

## Portfolio decarbonization constraint

- Carbon budget constraint on the portfolio: the weighted-average portfolio emissions must be abated by level  $\tau_B$ :

$$\sum_{j=1}^M x_{i,j} e_{j,1} = (1 - \tau_B) \sum_{j=1}^M x_{i,j} e_{j,0}$$

- In a simplified form, efforts of type H stocks must compensate the lack of efforts from type N stocks.
- Under this constraint, unique climate preference:

$$\delta = \gamma^2 \sigma_B^2 \left( a^* + (1 - a^*) \frac{e_{0,H}}{e_{0,N}} \frac{\tau_H - \tau_B}{1 - \tau_B} \left( 1 + \frac{\sigma_B^2}{\sigma_N^2} (1 - \lambda(1 - \tau_B)) (1 - \tau_B) \right) \right) \quad (16)$$

## Empirical illustration: identifying a climate risk premium

- Impact of a low-carbon target announcement on stock returns: we expect a **negative effect** on the price of a stock after a company has **announced a low-carbon target**.



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- We test our hypothesis using a **difference-in-differences** on residual returns of stocks, controlling for market, size and value factors (returns are extracted from the Kenneth R. French library).
- Groups: returns from a stock with an SBTi target publication during a 130 business days before and after the publication (treatment), returns from a stock within the same industry without an SBTi target (control).

# Empirical illustration: identifying a climate risk premium

Linear model for the difference-in-difference regression:

$$r_{res,i}(t) = \alpha_{i,p} d_p + \alpha_{i,g} d_g + \alpha_{i,p,g} d_p d_g + \epsilon_i(t)$$

with  $d_p$  and  $d_g$  the dummy variables:

- $d_p = 0$  when  $t < \text{Publication Date}$  and  $d_p = 1$  when  $t \geq \text{Publication Date}$ ;
- $d_g = 0$  for the company that has not set any target, and  $d_g = 1$  when the company has set a target.

Table: Identification of a climate risk premium.

Coefficients from the difference-in-difference regressions. The 'Control Group' column specifies the company which has not set a target. ' $\alpha_p$ ' and ' $\alpha_g$ ' are the coefficients from the time and group dummy variables. ' $\alpha_{pg}$ ' give an indication of the existence of a climate premium. \*, \*\* and \*\*\*: significant results at the 10%, 5% and 1% confidence intervals respectively.

Company	Control Group	Industry	Publication Date	Coefficients		
				$\alpha_p$	$\alpha_g$	$\alpha_{pg}$
Electricite de France SA	Exelon Corporation	Utilities	10/12/2020	-0.00054	0.00434*	-0.01010**
Electricite de France SA	Pinnacle West Capital Corporation	Utilities	10/12/2020	-0.00139	0.00434*	-0.00925**
Electricite de France SA	Fortum Oyj	Utilities	10/12/2020	0.00024	0.00434*	-0.01088***
ENGIE	National Fuel Gas Company	Utilities	27/02/2020	0.00448*	0.00193	-0.01001**
ENGIE	Osaka Gas Co., Ltd.	Utilities	27/02/2020	0.00334	0.00193	-0.00887**
SSE	Fortum Oyj	Utilities	16/12/2021	-0.00593***	-0.00079	0.00736*
Continental AG	Goodyear Tire & Rubber Company	Automobile & Components	03/12/2020	0.00612*	0.00142	-0.00981*
Continental AG	Magna International Inc.	Automobile & Components	03/12/2020	0.00331	0.00142	-0.00700*
Air Liquide SA	Air Products and Chemicals, Inc.	Materials	19/05/2022	0.00132	0.00200	-0.00577**
Stora Enso Oyj Class R	Avery Dennison Corporation	Materials	21/10/2021	-0.00114	-0.00228	0.00587**
Stora Enso Oyj Class R	International Paper Company	Materials	21/10/2021	-0.00267	-0.00228	0.00740**
Stora Enso Oyj Class R	Packaging Corporation of America	Materials	21/10/2021	-0.00086	-0.00228	0.00559*
Stora Enso Oyj Class R	Sonoco Products Company	Materials	21/10/2021	-0.00166	-0.00228	0.00638**
Wheaton Precious Metals Corp	Sonoco Products Company	Materials	12/05/2022	0.00238	0.00100	-0.00732**
Wheaton Precious Metals Corp	Avery Dennison Corporation	Materials	12/05/2022	0.00261	0.00100	-0.00755**
ANA Holdings Inc.	Deutsche Lufthansa AG	Transportation	08/12/2022	0.00458**	0.00243	-0.00805**
Kuehne & Nagel International AG	Copa Holdings, S.A. Class A	Transportation	15/07/2021	0.00287	0.00199	-0.00597*
Kuehne & Nagel International AG	Old Dominion Freight Line, Inc.	Transportation	15/07/2021	0.00159	0.00199	-0.00469*
Kuehne & Nagel International AG	AerCap Holdings NV	Transportation	15/07/2021	0.00202	0.00199	-0.00511*
Norfolk Southern Corporation	Aurizon Holdings Ltd.	Transportation	29/07/2021	-0.00146	-0.00215	0.00452*

# Agenda

- 1 Context: climate scenarios and transition plans
- 2 Motivations: low-carbon targets and financial risk
- 3 Model: alignment strategies and returns to ability
- 4 Market equilibrium and empirical identification of a climate risk premium
- 5 Conclusion**

## Key takeaways and recommendations

- The ability of firms to abate their emissions is a determining factor for their strategy.
- Existence of non-monotonous solutions on alignment strategies: existence of a tipping point for optimizing the number of commitments.
- Investors should estimate the ability of firms to decarbonize and consider the credibility of transition plans.
- Benchmark pathways should remain below a tipping point, otherwise risking climate inaction from companies.
- Policies should take into account the appetite of investors for climate stocks as well as the risk profile of firms to orient investments.

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