# **Climate Capitalists**

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#### **Motivation**

Challenge: incentivize green investments, despite low carbon taxes

### Cost of capital approach

- Green funding (e.g., buy green stocks)  $\uparrow \rightarrow$  green CoC  $\downarrow \rightarrow$  green investment  $\uparrow$
- Can work like carbon tax (Chitarro et al. 2024; Pedersen 2023)
- Even if returns to brown production are high and taxes low

#### **Broad interest**

- 25% of fin. assets under management in ESG funds in 2024
- Green investors: ECB, government funds, BlackRock, Catholic Church, ...

### Real impact unclear

- Depends on how firms set their CoC
- CoC unobserved, no agreed calculation, no quant. analysis
- Hard to measure using fin. prices or surveys
- 21% of academics say green firms have lower CoC; 23% no; 55% unsure

#### **Main Results**

- Hand-collected data on CoC used by firms
- 2. Across firms: CoC of green firms lower since 2016
  - Greenness 3rd-strongest predictor of CoC
  - Suggests: increased investment by green firms
- 3. Within firms: Large energy firms use lower CoC for green divisions since 2016
  - Suggests: brown firms become greener
- 4. Magnitude in 2023: 2 ppt.
  - 100\$ CO2 tax  $\approx$  6-10 ppt. (Pedersen 2023; Chitarro et al. 2024)
  - Sizable potential of CoC channel
- 5. Implications
  - Changes over time in green CoC, so firms willing to adjust
  - Variation within firms, so some firms are sophisticated
  - Open question on drivers: investor taste, risk, managers' views?

### **Framework: Investment Decisions**

- 1. Firms invest if
- expected return of project > CoC +  $\kappa$
- 2. CoC = managers' perception of expected return to debt & equity (WACC)
  - Firms use asset pricing models, past returns, subjective beliefs
- 3.  $\kappa$  = wedge, capturing:
  - project-specific risk, preferences, or option value
  - · correction for inflated cash flow estimates
  - · financial and capacity constraints
- 4. Today: focus on CoC
  - · Key long-run determinant of investment

Nestlé, Q4-2006: "We use an average cost of capital of 7.5%."

Air Canada, Q3-2017: "... our weighted average cost of capital of 7.6%."

Phillips 66, Q2-2022: "... our weighted average cost of capital of 10%."

#### **Data collection**

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#### **Data collection**

- Manually read transcripts with RA team
- 110k paragraphs containing keywords, 2002-22
- Analyze only firm-level CoC; separately collect project-specific numbers

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#### **Data collection**

#### Data overview

- 3,200 observation of perc. CoC for 1,200 firms in 20 countries
- Representative, except larger firms
- Firms with perc. CoC account for 40% of Compustat assets
- Data under costofcapital.org

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#### **Data collection**

#### Data overview

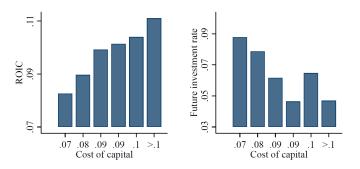
#### Verifiable data

- Calls are repeated high-stakes interactions (Hassan et al. 2019)
- Information from conference calls used in security lawsuits
- Data validation in paper and next

## **Perceived Cost of Capital and Real Outcomes**

Perceived CoC influences real decisions, so it generates:

- lower investment
- higher average realized returns

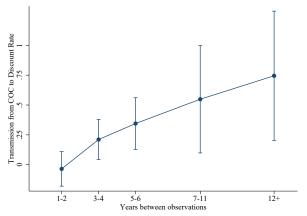


Magnitudes consistent with standard model and robust to controls

### Why Does CoC Matter?

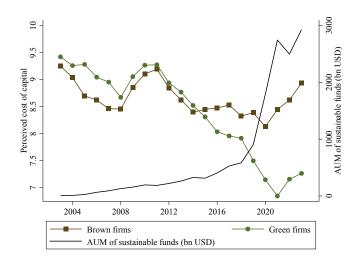
Investment depends on hurdle =  $CoC + \kappa$ 

Changes in CoC incorporated in long run



Analysis requires within-firm data, previous surveys inconclusive (e.g., Poterba and Summers 1995; Meier and Tarhan 2007; Sharpe and Suarez 2021; Graham 2022)

### Firm-Level CoC



Measure firm-level greenness based on MSCI data, split at median

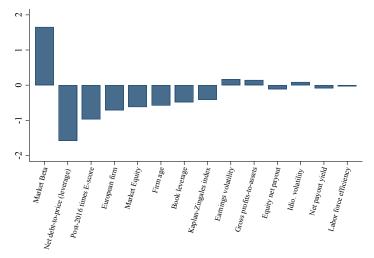
### Firm-Level CoC

- MSCI E-score ranges from 0 to 1
- Controls: leverage, beta, market value, book-to-market, quarter-year

		ital				
		US sampl	e	Global sample		
E-score	-0.53	0.22	0.94	-1.38***	-0.74	-0.10
	(0.40)	(0.52)	(0.61)	(0.38)	(0.45)	(0.49)
E-score $\times$ Post-2016		-1.90**	-2.12**		-1.46**	-1.71***
		(0.87)	(0.84)		(0.65)	(0.60)
Controls:	No	No	Yes	No	No	Yes
Observations	1,026	1,026	885	1,606	1,606	1,384
Within R <sup>2</sup>	0.0029	0.012	0.15	0.021	0.027	0.19

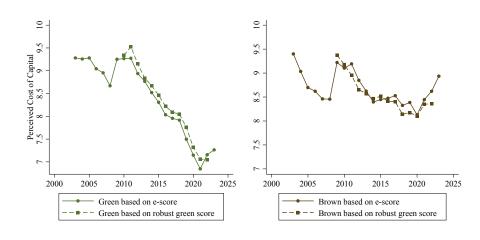
## **Greenness: Key Predictor Among Factor Zoo**

- Estimate predictors of perc. CoC using Lasso
- 150 factors from Jensen et al. (2021)
- E-score post-2016 is 3rd-largest predictor



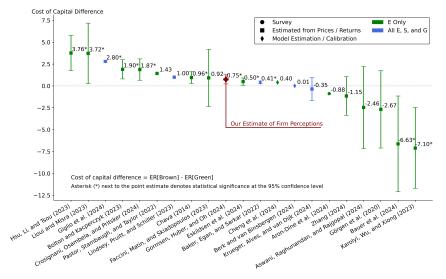
### **Robust to Alternative Green Measures**

Use "robust green score" from Eskildsen et al. (2024)



#### **Estimates in the Literature**

- Literature using fin. prices: much uncertainty on what firms should use
- We observe the CoC used by firms



### Within-Firm Variation

- Some firms apply different CoC or hurdle to green divisions
- E.g., Shell

### Disciplined, value-focused capital allocation

	\$ billion	Co		sh Capex		Cash Capex after power dilutions	FCF	IRR hurdle rates
		2022	2023	24-25	Power dilutions	24-25	2025	
Integrated Gas	IG	4	~5	~5		~5	~8	11%
Upstream	UP	8	~8	~8		~8	~10	15%
Integrated Gas and Upstream	IGU	12	~13	~13		~13	17-18	
Marketing (gas stations)	MKT	5	~6 <sup>2</sup>	~3		~3	~4	MKT ex. LCF/EV 15% LCF 12% EV 12%
Chemicals & Products	C&P	4	3-4	3-4		3-4	~5	12%
enewables & Energy Solutions	R&ES	3	2-4	4-5	(1-2)	~3	~(2)	R&ES excl. power 10% Power generation 6-8%
Downstream and enewables & Energy Solutions	DSR	12	11-14	10-12		9-10	7-8	
	Total	25	23-27	22-25		21-23	24-26	

<sup>1</sup> For price assumptions see appendix <sup>2</sup> Includes acquisition of Nature Energy (nearly \$2 billion)

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## **Division-Level Cost of Capital**

- Search slides of 200 largest energy & utility firms
- 50 firms report division values
- Includes Shell, BP, Total, EDF (jointly 4% of global emissions)
- Consistent with capital reallocation toward green divisions since 2016

	(1)	(2)	(3)
	Regulated CoC	Perceived CoC	Hurdle
Green division	0.49	-0.84***	-4.06**
$\times$ Post-2016	(0.36)	(0.20)	(1.57)
Green division	-3.07	0.043	2.65
× Pre-2016	(2.57)	(0.74)	(1.57)
Brown division	0.21	0.16**	-0.0096
	(0.25)	(0.063)	(0.57)
Observations	443	193	248

### **Potential Drivers**

- 1. CoC: Investor preferences
  - Taste for green fin. assets  $\uparrow \to \exp$ . returns  $\Downarrow \to CoC \Downarrow$
  - Consistent with realized fin. returns  $\uparrow$  unexpectedly (Pástor et al. 2022)
  - Consistent with heterogeneous beliefs and green investors expecting higher returns (Aron-Dine et al. 2024; Giglio et al. 2025; Edmans et al. 2024)
- 2. CoC: Risk assessment
  - Green firms' risk  $\Downarrow \rightarrow$  exp. returns  $\Downarrow \rightarrow$  CoC  $\Downarrow$
  - · Could be due to future regulation
- 3. Hurdle: Managerial views
  - Believe that risk has fallen more than exp. returns in fin. markets
  - · Want to make firm greener by favoring green divisions
  - May explain why effect on hurdle > effect on CoC

## Low Green CoC, Low Pledged Emissions

- Cannot observe long-run emissions of post-2016 investments
- Observe post-2016 emissions pledges
- Compare to green CoC in firm's sector post-2016
  - Depends on risk of substitution from brown to green production
  - E.g., green CoC high in mining, low in food

	Firm-level (	CO2 change (pct)	Firm-level CO2 change per year (pct)		
Brown CoC in sector	-15.5**	-17.0**	-2.38***	-2.08***	
	(4.89)	(5.37)	(0.67)	(0.57)	
Green CoC in sector	6.88**	2.91	1.41**	-0.067	
	(2.79)	(4.63)	(0.51)	(0.48)	
Fin. CoC (CAPM)		7.01		1.31*	
		(5.13)		(0.63)	
Return on equity		1.25		0.45***	
		(1.02)		(0.13)	
Tobin's Q		-0.78		-2.19*	
		(7.40)		(1.00)	
Observations	615	615	520	520	
$\mathbb{R}^2$	0.49	0.50	0.12	0.13	

### **Conclusion**

- 1. Analyze CoC used by firms
- 2. Lower green CoC since 2016
- 3. Firms incorporate changes over time, so firms willing to adjust green CoC
- 4. Within-firm variation, so some firms are sophisticated
- 5. Suggests CoC channel has real potential

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#### **Framework**

- Firms produce output using green and brown capital
- Fall in green CoC leads to reallocation from brown to green capital
  - Channel 1: cross-firm reallocation
  - Channel 2: within-firm reallocation
- Relative strength of the two channels depends on
  - 1 Elasticity of substitution in product market
  - 2 Capital budgeting of firms

### Model

- Firms  $i \in [0, I]$  produce differentiated products to representative household

#### Households

Spends W to consume  $Q_i$  of each product, with elasticity of substitution  $\sigma$ :

$$U = \left(\int_{i=0}^{I} Q_i^{(\sigma-1)/\sigma} di\right)^{\frac{\sigma}{\sigma-1}}.$$
 (1)

#### Demand

$$Q_i = P_i^{-\sigma} \frac{W}{\mathbf{p}^{1-\sigma}}.$$
 (2)

where *P* is price and  $P^{1-\sigma} = \left( \int_{i=0}^{I} P_i^{1-\sigma} di \right)^{1/(1-\sigma)}$  is the price index

#### Firm production

Cobb-Douglas based on brown (K) and green (G) capital

$$Y_i(K_i, L_i, G_i) = K_i^{\alpha_i} G_i^{1 - \alpha_i}, \tag{3}$$

Brown firms:  $\alpha = 0.7$ , green firms:  $\alpha = 0.3$ .

## Firm Optimization (I)

#### **Baseline optimization**

$$\Pi_i^{\text{Baseline}} = \max_{K_i, G_i} P_i Y_i(K_i, L_i, G_i) - r^{\text{Brown}} K_i - r^{\text{Green}} G_i$$
 (4)

$$r^{\text{Brown}} = r$$
 and  $r^{\text{Green}} = r - \zeta$ 

Firms' choose optimal mix of capital

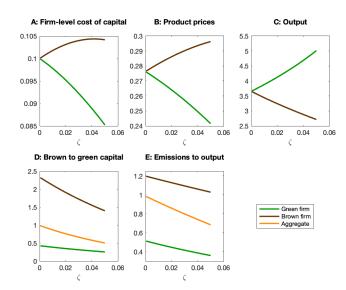
$$\frac{K_i^*}{G_i^*} = \frac{\alpha_i}{1 - \alpha_i} \times \frac{r^{\text{Green}}}{r^{\text{Brown}}}$$
 (5)

and quantities such that

$$P_i^* = \frac{\sigma}{\sigma - 1} \left( \frac{r^{\text{Brown}}}{\alpha_i} \right)^{\alpha_i} \left( \frac{r^{\text{Green}}}{1 - \alpha_i} \right)^{1 - \alpha_i}$$
 (6)

### **Results of Baseline Model**

Effects of increasing discount on green capital  $\zeta$  (and r)



## Firm Optimization (II)

#### Optimization with one cost of capital

$$\Pi_i^{\text{WACC}} = \max_{K_i, G_i} \quad P_i Y_i(K_i, L_i, G_i) - \text{WACC}_i(K_i + G_i), \tag{7}$$

$$WACC_i = r - \zeta(1 - \alpha_i)$$

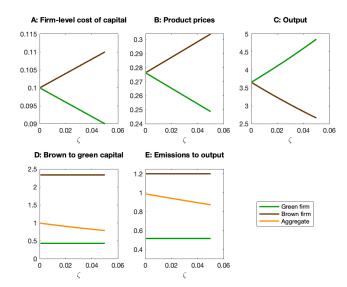
Firms' choose optimal mix of capital

$$\frac{K_i'}{G_i'} = \frac{\alpha_i}{1 - \alpha_i},\tag{8}$$

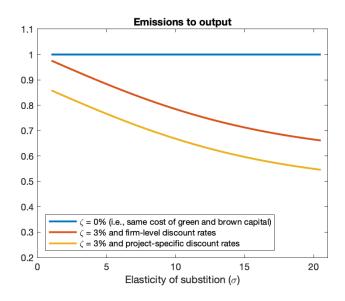
and quantities such that

$$P_{i}^{'} = \frac{\sigma}{\sigma - 1} \frac{\text{WACC}_{i}}{\alpha_{i}^{\alpha_{i}} (1 - \alpha_{i})^{1 - \alpha_{i}}}.$$
(9)

## **Results with Single Cost of Capital**



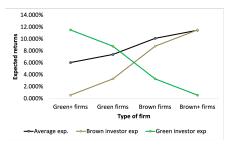
## **Comparison of the Two Channels**



## **Expectations, Preferences, and Holdings**

#### Toy model with CARA investors:

- Green (G) and brown (B) investors disagree about future value of green and brown firms (risk and disagreement symmetric)
- G and B have same risk capacity (no effect of disagreement on prices and true exp. return)
- G has preference for holding green stocks





#### Takeaway

- G holds green firms, support them with lower CoC, and believe green firms have high exp. returns