Limits to Private Climate Change Mitigation

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Sustainable investing to mitigate climate change

- Increasing urgency: "Scientists tell us this decade, 2020 to 2030, must be the decade of action" (John Kerry)
- 'First-best' policies like Pigouvian taxes face political constraints
- Many view sustainable investing as part of the way forward
 - "[T]he creation of sustainable index investments has enabled a massive acceleration of capital towards companies better prepared to address climate risk" (Larry Fink, 2021 letter to CEOs)
 - Sustainable funds in Europe accounted for 52 percent of net new flows in 2020 (Morningstar zeb ALFI 2021)
- Can sustainable investing (increasingly associated with 'ESG') meaningfully help mitigate climate change?

Can ESG investing shift production decisions?

- Sustainable investors could condition investment decisions on ESG scores, lowering cost of capital for 'good' firms
- For ESG investing to help, scores need to reflect changes in firms' contributions to climate change
- Approach motivated by high concentration of emissions
 - ► Just 96 'upstream' firms account for 70 percent of global stock of CO₂ emissions since 1850
 - We work with a panel of 52 firms with data on emissions and ESG accounting for a third of global emissions since 2002
 - We examine link between emissions and ESG scores for these firms

ESG scores unrelated to differences in emissions growth

Findings suggest limited scope for ESG investing to help



Literature

- Surveys on ESG investing: Matos (2020), Starks (2020), Cornell Damodaran (2020), IMF (2019)
- Empirical work drawing on firm-level emissions data
 - Data from US EPA: Naaraayanan Sachdeva Sharma (2020), Ivanov Kruttli Watugala (2020), Shive Forster (2020)
 - Voluntary disclosures to CDP: Ilhan Sautner Vilkov (2021), Bolton Kacperczyk (2020a, 2020b), Ioannou Li Serafeim (2016)
- Sustainable investing in theory: Oehmke Opp (2020), Green Roth (2021)
- Corporate governance: Berle (1930), Friedman (1970), Hart Zingales (2017), Broccardo Hart Zingales (2020), Zingales Kasperkevic Schechter (2020)

Emissions and ESG data

▶ Firm-level CO₂ emissions from Climate Accountability Institute

- Annual data based on production, not voluntary disclosures
- ► Covers 96 companies: 67 oil and gas producers, 25 coal producers
- Covers Scope 1 and 3 (downstream) emissions
- Many investors aim to incorporate Environmental, Social, Governance considerations
 - We obtain ESG data from Refinitiv, a prominent provider
 - Less disagreement on E (Gibson Krueger Schmidt 2021) Providers
 - Large emitters have high ESG and E scores (E scores calculated within industry) Large emitters
- Combined panel of 52 firms in 20 countries covers a third of global emissions from 2002-17

ESG scores and emissions growth: regression approach

 Regressions assessing link between ESG scores and emissions growth at the firm-year level

 $\Delta \ln(\mathsf{Emissions})_{i,t} = \alpha_i + \alpha_t + \beta \operatorname{Score}_{i,t} + \gamma X_{i,t} + \epsilon_{i,t}$

- Firm and year fixed effects
- Standard errors double clustered at firm and year level
- ► X_{it}: vector of firm (e.g. size, leverage, revenue) and country (e.g. real GDP growth, inflation) controls
- Emissions and controls winsorized at 5th and 95th percentiles

Scores do not capture contributions to climate change

	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Overall ESG Score	-1.1** (0.39)	-0.5 (0.45)	-0.5 (0.55)
Year fixed effects	Y	Y	Y
Country fixed effects	N	Y	Ν
Firm fixed effects	N	Ν	Y
Firm controls	Y	Y	Y
Country controls	Y	Y	Y
R ² (within)	0.13	0.19	0.34
Firm-years	683	683	683
Firms	52	52	52
Countries	20	20	20

Note: ESG scores scaled to have unit variance; In change in emissions multiplied by 100

Better E scores do not reflect lower emissions growth

	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Environment	0.3 (0.59)			
Emissions		0.5 (0.54)		
Resource Use			-0.1 (0.51)	
Env. Innovation				0.0 (0.31)
Year fixed effects	Y	Y	Y	Y
Firm fixed effects	Y	Y	Y	Y
Firm controls	Y	Y	Y	Y
Country controls	Y	Y	Y	Y
R ² (within)	0.34	0.34	0.34	0.34
Firm-years	683	683	683	683
Firms	52	52	52	52
Countries	20	20	20	20

Note: ESG scores scaled to have unit variance; In change in emissions multiplied by 100

Small magnitudes relative to scale of the problem



Note: Global carbon budget allocated proportionately to firms in panel

ESG scores and emissions growth: a visual assessment



Note: Largest increases are over four year periods

ESG scores reflect what firms say they do on climate

	Overall ESG Score	Environment
Attempt reduction in volatile organic compounds	0.56*** (0.12)	0.72*** (0.11)
Recognize climate risks & opportunities	0.60*** (0.10)	0.52*** (0.10)
Report environmental investments	0.41*** (0.11)	0.30** (0.12)
Report environmental partnerships	0.34*** (0.11)	0.37*** (0.10)
Year fixed effects	Y	Y
Firm fixed effects	Y	Y
Firm controls	Ŷ	Y
Country controls	Y	Y
R^2 (within)	0.89	0.88
Firm-years	683	683
Firms	52	52

Note: ESG scores scaled to have unit variance

Additional results and robustness

- ESG scores do not appear to improve over time Improvement over time
- Suggestive evidence that governance can help Governance
- ► Greater institutional ownership can help Ownership
- ► ESG scores are less informative for larger firms
 Firm size
- Robustness
 - Change in emissions intensity Emissions over revenue Emissions over assets
 - Emissions levels instead of growth Levels
 - Results with different timing Timing
 - Results without winsorizing Outliers

ESG investing: like a train on the wrong track

- Limited scope for sustainable investing conditioned (solely) on ESG to shift production incentives
 - Results could reflect issues with disclosure requirements, multidimensionality of ESG, scoring methodologies
 - Investors and policymakers (including central banks looking to manage carbon footprints) should use ESG with caution
- Approaches that could help shift the train in the right direction
 - Consistent standards and reporting requirements for all firms
 - Greater focus on measures that capture changes in firms' contributions to climate change
 - Continued efforts to build consensus for effective economy-wide policies like carbon pricing

Appendix

ESG providers disagree less about E



Note: Scores from Refinitiv shown on horizontal axis, and scores from S&P shown on vertical axis. Based on averages for a sample of 35 firms between 2013 and 2017

Large emitters have higher ESG and Environment scores



▶ Data

ESG scores do not appear to improve over time



Note: Figure shows R² from within-year univariate regressions

Suggestive evidence that better governance might help

	$\Delta \ln(Emissions)$	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Governance	-0.8* (0.44)			
Management		-0.7* (0.39)		
CSR Strategy			-0.5 (0.37)	
Shareholders				-0.2 (0.45)
Year fixed effects	Y	Y	Y	Y
Firm fixed effects	Y	Y	Y	Y
Firm controls	Y	Y	Y	Y
Country controls	Y	Y	Y	Y
R ² (within)	0.35	0.35	0.34	0.34
Firm-years	683	683	683	683
Firms	52	52	52	52
Countries	20	20	20	20



Institutional ownership can help

	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Overall ESG Score	0.1	0.5	-0.3
	(0.51)	(0.91)	(0.80)
Inst ownership	0.9***	0.6*	0.1
·	(0.26)	(0.34)	(0.45)
Overall ESG Score \times Inst ownership	-0.2***	-0.1	-0.0
	(0.04)	(0.07)	(0.06)
Year fixed effects	Y	Y	Y
Country fixed effects	N	Y	Ν
Firm fixed effects	Ν	Ν	Y
Firm controls	Y	Y	Y
Country controls	Y	Y	Y
R^2 (within)	0.18	0.24	0.35
Firm-years	567	567	567
Firms	50	50	50
Countries	20	20	20

Relationship weaker for larger firms

	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Overall ESG Score	-10.4**	-9.1*	-5.0
	(3.77)	(4.29)	(4.59)
Log Lag Assets	-0.5	-1.7	-1.0
	(1.58)	(1.79)	(1.66)
Overall ESG Score $ imes$ Log Lag Assets	0.4**	0.3*	0.2
0.0	(0.14)	(0.17)	(0.18)
Year fixed effects	Y	Y	Y
Country fixed effects	N	Y	N
Firm fixed effects	N	N	Y
Firm controls	Y	Y	Y
Country controls	Y	Y	Y
R^2 (within)	0.16	0.22	0.36
Firm-years	602	602	602
Firms	52	52	52
Countries	20	20	20

Weak relationship with emissions intensity growth

Emissions scaled by revenue

	$\Delta(Em/Revenue)$	$\Delta(Em/Revenue)$	$\Delta(Em/Revenue)$
Overall ESG Score	0.0	0.0	0.3
	(0.51)	(0.85)	(1.19)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls	Y N N Y Y	Y Y N Y Y	Y N Y Y
R ² (<i>within</i>)	0.51	0.53	0.55
Firm-years	683	683	683
Firms	52	52	52
Countries	20	20	20

Weak relationship with emissions scaled by assets

	$\Delta(Em/Assets)$	$\Delta(Em/Assets)$	$\Delta(Em/Assets)$
Overall ESG Score	-0.3	-0.7	-1.4
	(0.48)	(0.45)	(1.05)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls R^2 (<i>within</i>) Firm-years Firms	Y N N Y Y 0.24 683 52	Y Y N Y 0.27 683 52	Y N Y Y 0.33 683 52
Firms	52	52	52
Countries	20	20	20

Weak relationship with levels of emissions

	In(Emissions)	In(Emissions)	In(Emissions)
Overall ESG Score	0.20**	0.11	0.03
	(0.08)	(0.08)	(0.04)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls	Y N N Y Y	Y Y N Y Y	Y N Y Y
R ² (<i>within</i>)	0.44	0.75	0.95
Firm-years	683	683	683
Firms	52	52	52
Countries	20	20	20

	$\Delta \ln(Emissions)_{t+1}$	$\Delta \ln({ m Emissions})_{t+1}$	$\Delta \ln(Emissions)_{t+1}$
Overall ESG Score	-1.1**	-0.4	-0.0
	(0.39)	(0.41)	(0.50)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls R^2 (within) Firm-vears	Y N Y 0.12 683	Y Y N Y 0.19 683	Y N Y Y 0.34 683
Firms	52	52	52
Countries	20	20	20

	$\Delta \ln(\text{Emissions})_{t+2}$	$\Delta \ln(\text{Emissions})_{t+2}$	$\Delta \ln(\text{Emissions})_{t+2}$
Overall ESG Score	-1.2*** (0.32)	-0.8* (0.38)	-0.6 (0.47)
Year fixed effects	Y	Y	Y
Country fixed effects	N	Y	N
Firm fixed effects	N	N	Y
Firm controls	Y	Y	Y
Country controls	Y	Y	Y
R ² (within)	0.14	0.19	0.32
Firm-years	631	631	631
Firms	52	52	52
Countries	20	20	20

	$\Delta \ln(\textit{Emissions})_{t-1}$	$\Delta \ln(Emissions)_{t-1}$	$\Delta \ln(\textit{Emissions})_{t-1}$
Overall ESG Score	-1.1** (0.39)	-0.6 (0.45)	-0.4 (0.50)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls R^2 (within) Firm-years Firms	Y N Y Y 0.10 682 52	Y Y N Y 0.16 682 52	Y N Y Y 0.33 682 52
Countries	20	20	20

	$\Delta \ln(Emissions)_{t-2}$	$\Delta \ln(Emissions)_{t-2}$	$\Delta \ln(\textit{Emissions})_{t-2}$
Overall ESG Score	-1.0*	-0.1	0.7
	(0.55)	(0.67)	(0.98)
Year fixed effects Country fixed effects Firm fixed effects Firm controls Country controls R^2 (within) Firm-years Eirme	Y N Y Y 0.06 681 52	Y Y N Y 0.11 681	Y N Y Y 0.22 681 52
Firms	52	52	52
Countries	20	20	20

Results hold without winsorizing

	Δ In(Emissions)	Δ In(Emissions)	Δ In(Emissions)
Overall ESG Score	-1.3* (0.59)	-0.6 (0.53)	-0.6 (0.90)
Year fixed effects	Y	Y	Y
Country fixed effects	Ν	Y	N
Firm fixed effects	Ν	Ν	Y
Firm controls	Y	Y	Y
Country controls	Y	Y	Y
R ² (within)	0.08	0.15	0.26
Firm-years	683	683	683
Firms	52	52	52
Countries	20	20	20