How Do Climate Policies Affect Securities Holdings of Green and Brown Firms?

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The views expressed are those of the authors and not necessarily those of the Czech National Bank or the European Central Bank.

Introduction

- Growing interest in understanding the relationship between environmental policies and financial markets.
- We examine effects of climate policies on securities holdings of low- and high-carbon firms.
- Contribution to the literature:
 - Literature analyzing the effects of climate-related policy events on financial sector decisions: Krueger et al. (2020); Reghezza et al. (2022).
 - Literature showing that financial sector takes into climate risks into account: Ilhan et al. (2021); Bolton & Kacperczyk (2021); Ramelli et al. (2021).
 - Literature on securities holdings as such: Bekaert & Breckenfelder (2019);
 Papoutsi et al. (2021).
 - Literature on ESG performance and access to finance: Cheng et al. (2014);
 El Ghoul et al. (2011).
 - ► Dynamics of the low-carbon transition: Steg *et al.* (2014); Geels *et al.* (2017); Dietz *et al.* (2016); Campiglio *et al.* (2018), among others.
 - ► Theoretical models of climate finance: Pástor et al. (2021).

Main Takeaways

- Objective: Examine effects of climate policies and COVID-19 on securities of green vs. brown firms.
- Key Findings:
 - Financial sectors increase investments in green firms and decrease investments in brown firms after climate policy events.
 - Non-financial firms and households do the opposite: transfer of climate transition risks.
 - Governments response aligns more closely with the financial sector.
 - COVID-19 pandemic had similar impact: increase in green firms' securities and decrease in brown firms' securities.
 - Regional factors play a role: home bias; environmental performance of holder and issuer country.
- Implications:
 - Financial sector leads the transition towards financing more sustainable industries, with governments playing a supporting role.
 - Private non-financial sector might be vulnerable to climate transition risks.

Hypotheses and Events (1/3)

- We study changes in securities holdings around 5 specific events.
- Baseline: two significant climate policy events, Paris Climate Agreement (2015) and UN Climate Action Summit (2019).

Event	Date	Post=1 from	Firms	Exp. sign
Paris Climate Agreement (COP21)	Dec 2015	1Q 2016	green brown	+
UN Climate Action Summit (Greta Thunberg's speech)	Sep 2019	3Q 2019	green brown	+
COVID-19	Mar 2020	2Q 2020	green brown	+
Trump's announcement of withdrawal from COP21	Jun 2017	3Q 2017	US green US brown	+/- +/-
Biden's announcement of rejoining COP21	Jan 2021	1Q 2021	US green US brown	+

Hypotheses and Events (2/3)

- Following the COP21 and the 2019 UN Climate Action Summit, financial institutions increased securities holdings of green industries and decreased securities holdings of brown industries.
- Following the COP21 and the 2019 UN Climate Action Summit, the private non-financial sector increased securities holdings of brown industries, implying a shift of transition risk from the financial sector to the non-financial sector.
- The COVID-19 pandemic affected securities holdings of brown industries disproportionately more than those of non-brown (green and other) industries.
 - Carbon-intensive firms face higher risk premiums (Bolton & Kacperczyk, 2021) and increased tail risk associated with climate policy uncertainty (Ilhan et al., 2021).
 - After the COP21, European banks reallocated credit away from polluting firms (Reghezza et al., 2022).
 - During the pandemic, sustainable stocks experienced lower volatility (Shields et al., 2021) and higher resilience (Engelhardt et al., 2021; Albuquerque et al., 2020).

Hypotheses and Events (3/3)

- Financial institutions exhibit a home bias in their portfolio allocation decisions between green and brown industries, with a stronger preference for domestic or eurozone securities.
- The shift of securities holdings towards green industries is affected by the environmental performance of both the holder's and issuer's countries, with high-performance countries showing a stronger reallocation than low-performance countries.
 - ▶ Strong evidence for home bias in international investment portfolios (Ardalan, 2018).
 - Existing variation in countries' pro-environmental attitudes and their commitment to climate change mitigation (Hsu & Zomer, 2014).
- Following Trump's withdrawal from and Biden's rejoining of the COP21, financial institutions in the eurozone changed their allocation of securities holdings toward US green and brown industries.
 - Ramelli et al. (2021) show that carbon-intensive firms' stock prices reacted positively to President Trump's election.

Data (1/2)

We use two data sources:

- Securities Holdings Statistics by Sector (SHSS)
- Industry-level carbon emissions by Eurostat
 - Sensitivity analysis: firm-level emissions by Refinitiv Eikon

1) Securities Holdings Statistics by Sector (SHSS)

- Security-by-security confidential data at Q frequency (since 2014).
- Securities held by euro area resident sectors.
- Two instruments: equity and debt securities.
- Our baseline (majority of regressions):
 - Holders: financial sectors (banks, investment funds, IC&PF)
 - Issuers: non-financial firms; all around the world.
- But we examine non-financial sectors as securities holders as well (the risk-shifting hypotheses).

Summary Statistics

- Securities held by EA FIs issued by NFCs worldwide.
- Investment funds hold majority of securities, both equity and debt.
- Banks hold the least.
- Both EA and US NFCs constitute a large share of the sample.
 - ► EA: 22% of equities, 34% of bonds
 - ▶ US: 27% of equities, 36% of bonds
- NFCs from countries outside Europe and US issues about half of all equity securities held by EA FIs

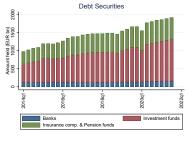
	E	quity securit	ies	Debt securities			
	Obs.	Mean	SD	Obs.	Mean	SD	
All	4,200,039	13.425	3.249	1,522,531	15.174	2.294	
By holder sector							
Banks	721,854	11.064	3.851	221,468	15.047	2.471	
Investment funds	2,241,638	14.444	2.783	757,140	15.412	2.233	
IC&PF	1,236,547	12.956	2.795	543,923	14.896	2.267	
By issuer country							
Euro area firms	921,028	13.933	3.269	524,563	15.520	2.398	
EU non-EA firms	206,020	12.901	3.215	74,396	15.241	2.242	
US firms	1,127,774	13.449	3.304	547,027	15.004	2.229	
Firms from other countries	1,945,217	13.226	3.182	376,545	14.927	2.188	

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Volume of SH: Financial Sectors

- Debt and equity securities holdings nearly doubled from 2014–2021.
- Investment funds hold most debt (two-thirds) and equity (90%) securities.

Figure: Volume of Securities Holdings by Financial Sector: Amounts in EUR Billion

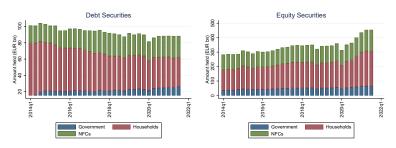




Volume of SH: Non-financial Sectors

- Non-financial sector holds vastly fewer debt (20x) and equity (6x) securities.
- Household debt securities holdings dropped, but equity securities raised, notably since 2020.

Figure: Volume of Securities Holdings by Non-Financial Sector: Amounts in EUR Billion



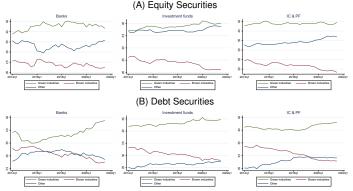
Data (2/2)

2) Carbon emissions

- Proxy for carbon intensity (carbon risk)
 - Financial markets differentiate firms by their carbon intensity (Ilhan et al., 2021; Bolton & Kacperczyk, 2021)
- Industry-level carbon emissions by Eurostat
- Broken down to 64 industries (NACE classification)
- Used to create a dummy variable for low-carbon (green) and high-carbon (brown) industries
 - Baseline: green (brown) industry = first (last) quartile of the distribution of the emissions per gross value added
 - Alternatives: quintiles; emissions per capita, emissions in absolute amounts

Green vs. Brown Securities: Financial Sectors

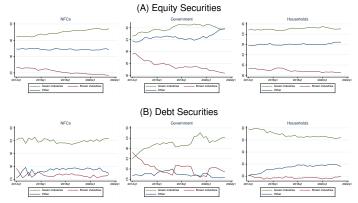
 The shift from brown securities holdings towards green or other securities is evident across most financial sectors.



Note: Y-axis represents the percentage share of green, brown, and other securities in total amount held by a respective sector.

Green vs. Brown Securities: Non-financial Sector

 Decrease in brown and increase in green holdings seems less pronounced for non-financial sector.



Note: Y-axis represents the percentage share of green, brown, and other securities in total amount held by a respective sector.

Methodology

- Firm (issuer) level difference-in-differences regression.
- Parallel trend assumption holds across financial institutions, green/brown firms and events.

$$log(SH_{i,j,t}) = \beta_1^G Green_{i,t} \times Post_t + \beta_2^G Green_{i,t} + \beta_3^G Post_t + \alpha_i + \alpha_t + \alpha_{js} + \alpha_{jc} + \epsilon_{i,j,t}$$

$$log(SH_{i,j,t}) = \beta_1^B Brown_{i,t} \times Post_t + \beta_2^B Brown_{i,t} + \beta_3^B Post_t + \alpha_i + \alpha_t + \alpha_{js} + \alpha_{jc} + \epsilon_{i,j,t}$$

- $ullet \ log(SH_{i,j,t})$: logarithm of holdings issued by firm i held by financial sector j at quarter t.
- Green_{i,t}, Brown_{i,t}: dummy variables for low- and high-carbon firms.
- Post_t: dummy variable for two years after the event.
- Very tight specification with multiple fixed effects for issuer (α_i) , time (α_t) , holder sector (α_{js}) and holder country (α_{jc}) .
- β_1^G , β_1^B : average percentage change in holdings following each event.

Results: COP21, Green Firms

(A) Equity Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Green	1.127 (0.923)		2.075** (0.871)		-0.013 (0.498)		0.090 (1.113)	
Green * Post	0.054***	0.046***	0.127***	0.111***	0.041**	0.024	-0.016	-0.007
	(0.015)	(0.015)	(0.031)	(0.033)	(0.017)	(0.017)	(0.022)	(0.022)
Observations Adjusted ${\cal R}^2$	1,522,932	1,522,932	255,955	255,955	816,251	816,250	449,782	449,782
	0.622	0.487	0.698	0.594	0.667	0.330	0.591	0.464

(B) Debt Securities

	(1) All	(2) All	(3) Banks	(4) Banks	(5) IF	(6) IF	(7) IC&PF	(8) IC&PF
Green * Post	0.238 (0.291) 0.062** (0.025)	0.061*** (0.023)	0.794 (1.073) 0.028 (0.048)	0.062 (0.047)	0.171 (0.249) 0.047* (0.028)	0.054** (0.026)	0.264 (0.363) 0.049 (0.032)	0.079** (0.032)
Observations Adjusted \mathbb{R}^2	546,764 0.404	546,764 0.253	72,231 0.456	72,231 0.361	271,214 0.627	271,214 0.248	202,818 0.559	202,818 0.310
Firm FE Time FE Holder Sector FE Holder Ctry FE Firm's Ind. x Ctry FE	Y Y Y	Y Y Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y

Results: COP21, Brown Firms

(A) Equity Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Brown	0.039 (0.252)		-0.767 (0.527)		-0.183 (0.376)		0.396* (0.213)	
Brown * Post	-0.046*** (0.017)	-0.026 (0.017)	-0.155*** (0.033)	-0.126*** (0.035)	-0.039* (0.020)	0.001 (0.019)	-0.037 (0.024)	-0.014 (0.025)
Observations Adjusted \mathbb{R}^2	1,522,932 0.622	1,522,932 0.487	255,955 0.698	255,955 0.593	816,251 0.666	816,249 0.329	449,782 0.591	449,78 0.463

(B) Debt Securities

			. ,					
	(1) All	(2) All	(3) Banks	(4) Banks	(5) IF	(6) IF	(7) IC&PF	(8) IC&PF
Brown * Post	-0.408 (0.636) -0.067*** (0.025)	-0.055** (0.023)	0.050 (0.490) -0.141*** (0.052)	-0.157*** (0.051)	-0.125 (0.645) -0.047 (0.029)	-0.005 (0.026)	-0.442 (0.727) -0.079** (0.031)	-0.096*** (0.032)
Observations Adjusted ${\cal R}^2$	546,764 0.404	546,764 0.253	72,231 0.456	72,230 0.357	271,214 0.627	271,214 0.247	202,818 0.559	202,816 0.309
Firm FE Time FE Holder Sector FE Holder Ctry FE Firm's Ind. x Ctry FE	Y Y Y	Y Y Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y

Results: UN Summit, Green Firms

(A) Equity Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Green * Post	-0.324 (0.550) 0.078*** (0.016)	0.056*** (0.015)	-0.201 (0.518) 0.039 (0.030)	0.066** (0.033)	-0.381 (0.535) 0.097*** (0.018)	0.050*** (0.017)	-0.479 (0.889) 0.093*** (0.020)	0.071*** (0.020)
Observations Adjusted \mathbb{R}^2	1,644,529	1,644,529	236,282	236,282	863,966	863,966	542,817	542,816
	0.629	0.483	0.726	0.581	0.663	0.331	0.599	0.480

(B) Debt Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Green * Post	0.196 (0.514) 0.099*** (0.020)	0.092*** (0.019)	0.300 (1.192) 0.043 (0.039)	0.049 (0.039)	-0.112 (0.336) 0.102*** (0.026)	0.070*** (0.023)	0.091 (0.515) 0.100*** (0.025)	0.114*** (0.023)
Observations Adjusted \mathbb{R}^2	670,521 0.423	670,521 0.265	86,518 0.494	86,515 0.413	314,581 0.635	314,579 0.237	268,867 0.563	268,865 0.330
Firm FE Time FE Holder Sector FE Holder Ctry FE Firm's Ind. x Ctry FE	Y Y Y Y	Y Y Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y

Results: UN Summit, Brown Firms

(A) Equity Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Brown * Post	0.790 (0.590) -0.068*** (0.017)	-0.039** (0.017)	0.337 (0.547) -0.056* (0.033)	-0.044 (0.035)	0.889 (0.798) -0.095*** (0.020)	-0.049** (0.019)	1.149** (0.492) -0.073*** (0.022)	-0.043* (0.022)
Observations Adjusted ${\cal R}^2$	1,644,529	1,644,529	236,282	236,282	863,966	863,966	542,817	542,816
	0.629	0.483	0.726	0.581	0.663	0.331	0.599	0.480

(B) Debt Securities

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	All	All	Banks	Banks	IF	IF	IC&PF	IC&PF
Brown * Post	0.810 (0.602) -0.092*** (0.020)	-0.070*** (0.019)	1.627 (1.053) -0.008 (0.042)	-0.003 (0.042)	0.205 (0.652) -0.096*** (0.026)	-0.065*** (0.024)	0.707 (0.522) -0.079*** (0.024)	-0.077*** (0.023)
Observations Adjusted \mathbb{R}^2	670,521 0.423	670,521 0.265	86,518 0.494	86,515 0.413	314,581 0.635	314,579 0.237	268,867 0.563	268,865 0.330
Firm FE Time FE Holder Sector FE Holder Ctry FE Firm's Ind. x Ctry FE	Y Y Y	Y Y Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y	Y Y - Y

Re-Allocation of Risks Towards NFS

- Same firm-level regression, but with non-financial sector as a holder.
- Firms and households increase equity holdings of brown firms and reduces that of green firms following both events.
 - Increase in equity holdings of brown firms by 8% after COP21 and 12% and the UN Summit.
 - Decrease in equity holdings of green firms by 3% after COP21 and 5% after the UN summit.
- Governments are more "responsible": reaction more aligned to that of financial sector.
- Results for debt security holdings are mostly not significant.
- ⇒ Transfer of climate-related risks from financial to non-financial sector.
- ⇒ Financial sector leading the transition towards financing more sustainable industries, with governments supporting.

Additional Results: Who Drives Observed Effects? (1/2)

Home bias

- Is there a bias in favor of domestic securities in international investment portfolios?
- Measured at country-level and EA-level.
- Triple interaction with dummy variable Home equal to one if the holder's country is the same as the issuer's country.
- Results:
 - Home bias present in general (irrespective of carbon intensity).
 - The effects on triple interaction are visible after the UN summit and for equity securities.
 - Brown equity securities: the effect is driven by the drop in holdings of non-EA firms (-8.9% vs. +2.5% for EA).
 - Green equity securities: equity exposure to EA green firms increases less than that to non-EA (foreign) green firms.

Additional Results: Who Drives Observed Effects? (2/2)

Environmental performance of holder and issuer country

 Triple interaction with Environmental Performance Index (EPI) by Hsu & Zomer (2014) to categorize countries (both holders and issuers) into "high" and "low" environmental performers.

Results:

- The coefficient on double interaction Green (Brown) * Post remains very similar to baseline results.
 - I.e., environmental performance cannot fully explain changes in holdings of securities.
- After the UN summit, increase in green equity holdings is largely driven by issuers (firms) and holders (financial institutions) from high-EPI countries.
- The effects are especially pronounced after the UN Summit and for investment fund.

Additional Results: More Events

COVID-19 pandemic

- The negative impact on brown holdings was stronger than the positive impact on green holdings.
- Primarily driven by non-banks.
 - Drop in brown equity holdings of 9–16%; increase in green equity holdings 3–7%.
 - Drop in brown debt holdings of 7–13%; increase in green debt holdings 7–11%.
- In line with the literature on carbon risk premiums.

US firms: Trump's withdrawal and Biden's rejoining of COP21

- The effect is statistically significant only for Trump's withdrawal.
- EA financial institutions shifted their debt financing away from green US firms and towards brown US firms.
- Equity financing displayed an opposite trend.

Robustness Exercises

- Different combinations of fixed effects.
 - Differences related to the inclusion of holder country or issuer country fixed effects (hence, we tested regional effects).
- Different definitions and data sources to create dummy variables for green and brown firms.
 - Firm-level emissions from Refinive Eikon (similar results with generally higher magnitude of effects, especially for UN summit).
 - Absolute volume of carbon emissions, carbon emissions per capita, and carbon emissions per gross value added. Quartiles and Quintiles of the distribution.
- Reduced estimation window around events to one year.
 - Qualitatively similar results; weaker after COP21 and stronger after UN summit.
- New vs. old securities.
 - Triple interaction term with a dummy variable equal to one for newly issued securities (those that are no more than one year old).
 - Not significant results, the age of a security does not significantly impact our results.

Conclusions

- Financial sectors increase investments in green firms and decrease investments in brown firms after climate policy events.
 - Higher transition risks for carbon-intensive companies and financial institutions.
 - Higher reputation risks linked to financing of less environmentally-friendly firms.
- Type of security: the effect on debt securities seems more pronounced.
- Sector: Banks played a significant role after COP21; non-banks (especially investment funds) after the UN Summit.
- Non-financial firms and households do the opposite: increase in equity holdings of brown firms and decrease in equity holdings of green firms.
 - Transfer of climate transition risks from financial to non-financial sector.
 - ► Financial sector leading the transition towards financing more sustainable industries, with governments supporting.
- Covid-19 pandemic had similar impact: increase in green firms' securities and decrease in brown firms' securities.
- Regional factors play a role: home bias; environmental performance of holder and issuer country.

Thank you for your attention!

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