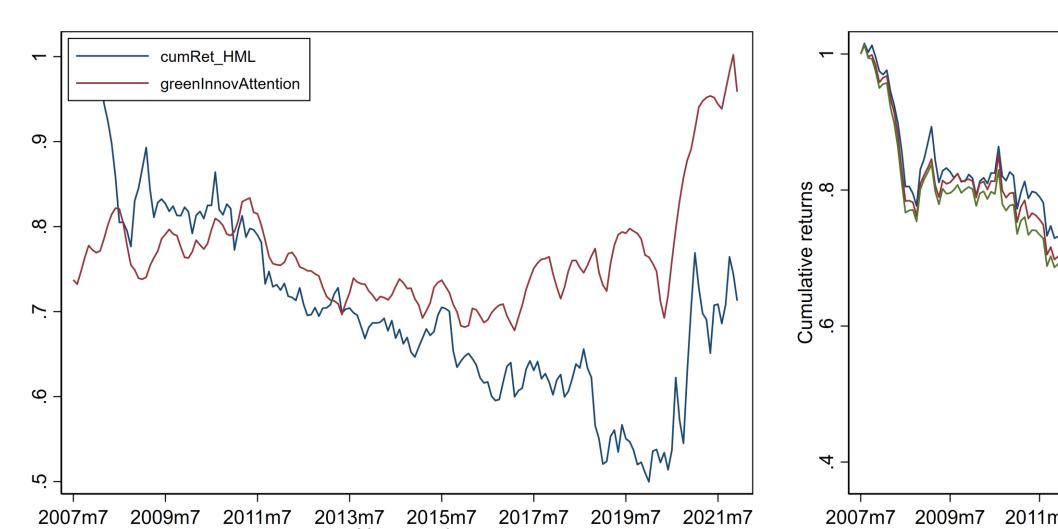
Firms inventing and adopting green technologies, including many from carbon-intensive sectors, exhibit lower expected returns than their industry peers.



Cumulative returns 8 - Raw FF6 FF6_attention

Main contribution

(1) New measure:

Provide a **firm-level green innovation measure** by utilizing **ClimateBERT** and **GPT-3** models on earnings call transcripts.

- → categorize firms into green inventors and green adopters.
- → climate policies effectively incentivize green innovation but predominantly among financially unconstrained companies within the green inventors.

(2) Asset pricing implications:

Companies with increased green innovation experience:

- 1. lower expected returns.
- 2. reduced carbon emissions and fewer climate incidents.
- 3. **value increase** during enforcement of <u>stringent climate</u> regulations and <u>recent heightened attention</u>.
- → Pricing effects are most pronounced for clean energy and electricity power.



The Green Innovation Premium

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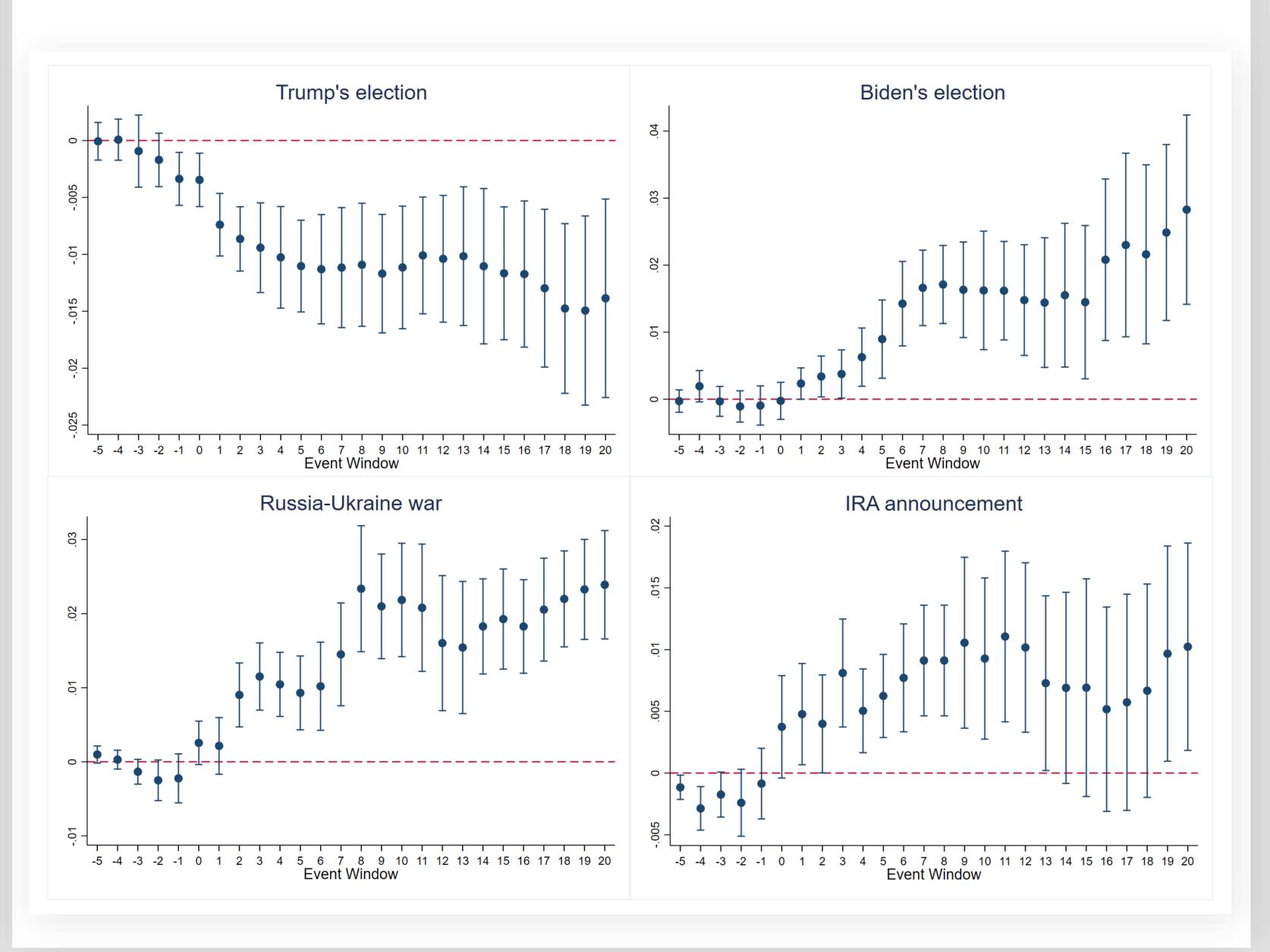
The negative premium

A portfolio that is long (short) on firms with low (high) green innovation activities generates an average return of about 6% per year.

The recent two-year **surge in investor attention** to green innovation results in **increased demand and prices** for green innovating firms.

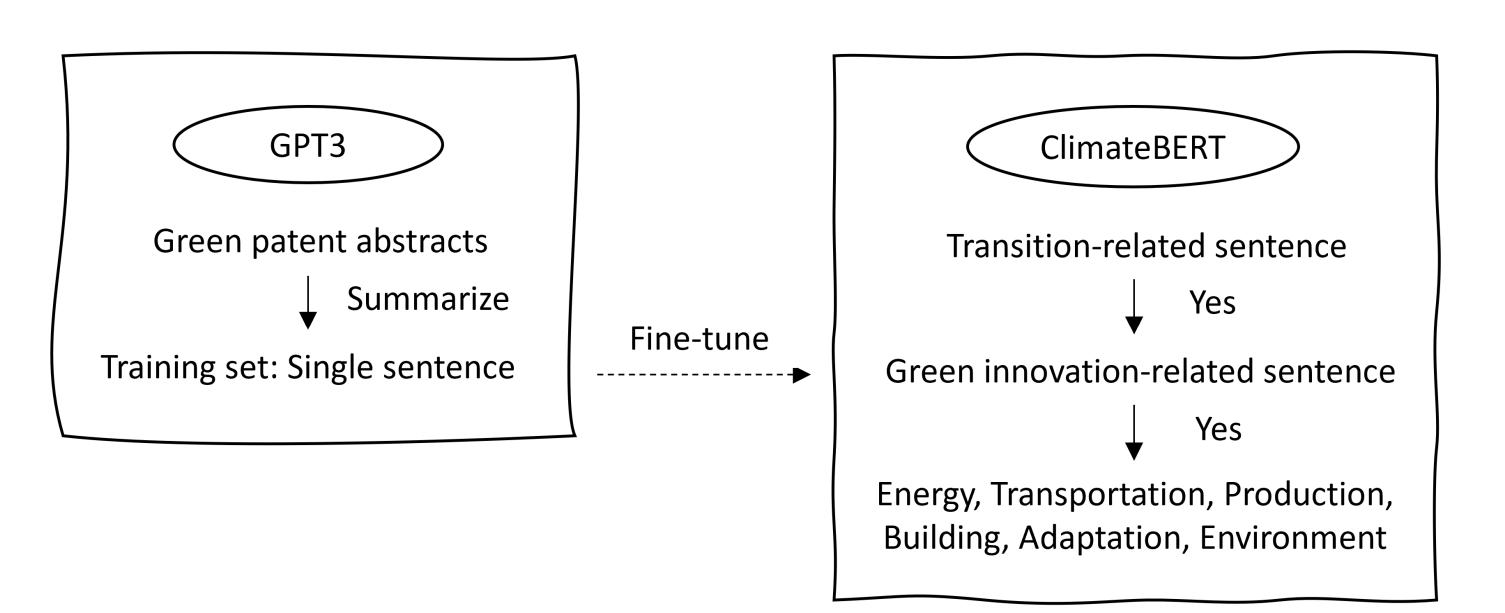
	Low	2	3	4	High	HML	FF3+Mom	FF5	HXZ q
VW	1.03**	0.90***	0.45	0.70*	0.57	-0.46***	-0.52***	-0.53**	-0.46**
	(2.38)	(2.63)	(0.94)	(1.74)	(1.15)	(-2.88)	(-2.67)	(-2.50)	(-2.32)
ew	0.85*	0.68	0.54	0.59	0.09	-0.77***	-0.77***	-0.67***	-0.73***
	(1.77)	(1.19)	(0.97)	(1.24)	(0.16)	(-5.51)	(-4.76)	(-3.81)	(-4.11)

Green innovating firms exhibit greater resilience and adaptability when facing potentially stringent environmental policies.



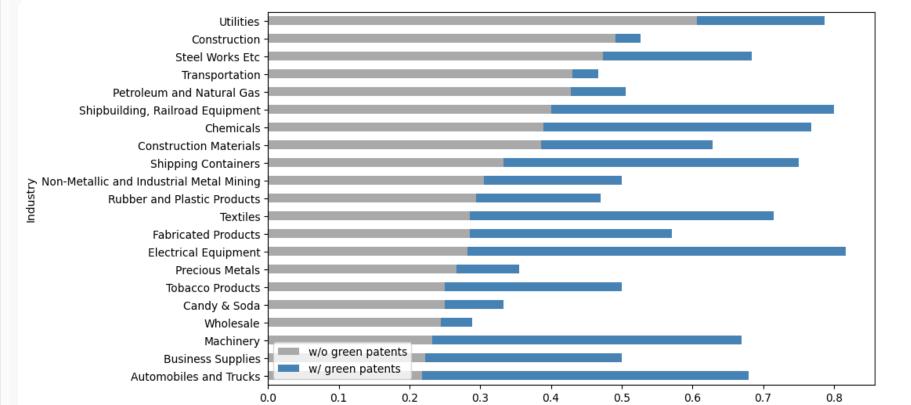
NLP method

Broader green innovation strategies that are unfeasible to patent. **Precisely** focus on critical green innovation activities in real time due to the brief available time and investor attention during earnings calls.



$$GreenInnov_{i,t} = N_{i,t}^{greenInnov}/N_{i,t}$$

Green inventors vs. green adopters



Active inventors:

Electrical equipment, Automobiles.

Prominent adopters:

Construction, Transportation.
Combination of the two:
Utilities, Chemicals, Machinery.

Stock markets price green innovation activities beyond the realm of patents.

The adoption of both in-house and external green technologies improves the future environmental performance.

