

Net zero emissions and price signalling

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CompNet



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Outline

NZE and price signaling

- Motivation
- Research question
- Sample
- Stylized facts
- Model
- Calibration
- Technical change bias
- Conclusion

Box 1: CompNet-OECD collaboration

Box 2: CompNet-OeNB collaboration

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references

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- To reach NZE by 2050, the EU needs to cut fossil fuel use from 73% to 20%, but current policies only achieve 60% ([ECB 2024](#))
- Social costs of carbon estimates ([Hambel, Van den Bremer, and Van Der Ploeg, 2024](#)) of 182\$/t Co₂ are more than 3x the world average carbon prices ([WB, 2024](#))
- Price signals are crucial for accelerating the green transition
 - via energy efficiency ([André et al., 2023](#))
 - by directing technology towards green innovation (technical change literature, see review [Hémous and Olsen, 2021](#))

This paper

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- Investigates the efficacy of energy prices in accelerating the green transition
 - by studying how firms responds to energy shocks via
 - their capacity to change their energy mix (elasticity of substitution)
 - their innovation (clean/dirty) incentives (technical change bias)

- Roadmap:
 - 1 Sample
 - 2 Price elasticity of energy demand estimates
 - 3 Model & parameters calculation
 - 4 Energy price simulations
 - 5 Technical change bias

Energy market

Supply-demand

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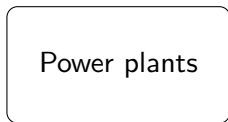
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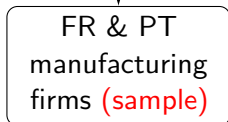
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Supply



Demand

- generate electricity using mainly clean sources (renewables and nuclear);

- France: +80% clean

- Portugal: +60% clean

- consume clean and dirty energy sources to produce output:

- Clean: electricity, steam, renewable

- Dirty: natural gas, oil and fossil fuel related

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- Sample: France (2000-2020) and Portugal (2010-2020)
 - to be expanded to Slovenia, Austria, and Germany
- Datasets used:
 - SBS¹ and BS (balance-sheet): used to recover firms' characteristics (e.g., size, age, turnover, etc.)
 - Energy: firms' energy expenditure and consumption → prices
 - disaggregated by energy source (natural gas, coal, fossil fuel related, electricity, etc.)

¹Structural business statistics (Eurostat): detailed structure, economic activity, and performance of businesses over time

Stylized facts

Price elasticity of energy demand: specification

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How do energy prices impact firm-level energy consumption?

- Estimate log-log within-firm identification strategy:

$$E_{i,s,t} = \beta P_{i,s,t} + \theta_i + \theta_{s,t} + \epsilon_{i,s,t} \quad (1)$$

E & P: energy consumption and price, i: firm, t: year, s: sector

- β likely to be endogenous due to OVB²
- To identify (1) shift-share IV à la [Fontagné, Martin, and Orefice, 2024](#):
 - $p_{i,s,t}^{IV} = \left[\frac{p_{i,s,t_0}}{\bar{p}_{s,t_0}} \right] \times \bar{p}_{s,t}$ (exclude the i price on s average).
 - I.e., it multiplies P_i at t_0 (i.e., when firm enters the sample) by the growth rate of the sectoral average price at year t .

²E.g., Demand and technological shocks relate to inputs and energy prices consumed and negotiated by firms.

Stylized facts

Price elasticity of energy demand: results

Table: Price elasticity of clean and dirty energy demand

Dependent Variable: <i>Firm E_{type} demand</i> (ln)				
	FR		PT	
<i>E_c</i> price (ln)	-0.7501*** (0.0432)	-0.1725* (0.073)	-0.9030*** (0.0076)	-0.9691*** (0.0469)
Obs	150,336	149,271	478,959	469,140
R2	0.946	0.944	0.937	0.936
1st stage		0.6345***		0.5178***
F-test (IV)		31,890.2		30,855.6
<i>E_d</i> price (ln)	-0.9568*** (0.1112)	-0.1719 (0.1298)	-0.9129*** (0.0127)	-0.8519*** (0.0759)
Obs	127,555	119,190	323,308	281,420
R2	0.92818	0.927	0.962	0.963
1st stage		0.4775***		0.1146***
F-test (IV)		12,636.8		2,736.3

Notes: Significance levels: * p<0.1; ** p<0.05; *** p<0.01.
Standard errors clustered at firm-level. Year and firm fixed effects added.

- Why such a difference between countries?

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Firm's problem

Nested-CES

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Top-Level CES in X and E

Production is a function of energy (E) and other inputs (X);

$$Y = \left[\delta X^\phi + (1 - \delta) E^\phi \right]^{\frac{1}{\phi}}, \quad \phi < 1, \quad 0 < \delta < 1 \quad (2)$$

$\sigma_{XE} = \frac{1}{1-\phi}$: elasticity of substitution between X and E ;

Inner CES Clean vs Dirty Energy

Clean (E_c) and dirty (E_d) energy combined; A efficiency;

$$E = \left[\alpha (A_c E_c)^\rho + (1 - \alpha) (A_d E_d)^\rho \right]^{\frac{1}{\rho}}, \quad 0 < \alpha < 1, \quad (3)$$

Maximization

Lemmas

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Top-Level CES in X and E

- Min costs ($C = wX + p_E E$) w.r.t. X & E yields E demand;
- Partial own-price elasticity of E w.r.t. p_E :

$$\eta_{E,p_E} = -\sigma_{XE} \theta_E \quad (4)$$

where θ_E is firms' energy cost share.

Inner CES Clean vs Dirty Energy

- Minimizing energy costs w.r.t E in (3) yields

$$\frac{E_c}{E_d} = \frac{\alpha}{1-\alpha} \left(\frac{p_d/A_d}{p_c/A_c} \right)^{\frac{1}{1-\rho}} \quad (5)$$

$\sigma_{cd} = \frac{1}{1-\rho}$: elasticity of substitution between E_c and E_d

Summary statistics

Prices and energy mix

NZE and price signaling

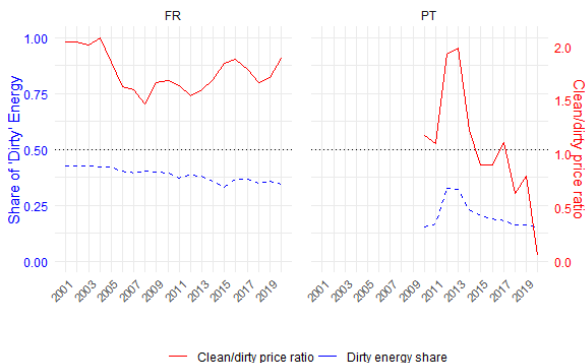
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Dirty energy share &
Clean/dirty energy price ratio (median) - annual trends



- P_c has fallen more sharply than P_d , especially in PT;
- Share of E_d has declined gradually in both countries.

Model parametrization

Elasticity of substitution between E_d and E_c (σ_{cd})

- To identify σ_{cd} , I log-linearize (5) and instrument prices as in (1):

$$\ln\left(\frac{E_d}{E_c}\right) = -\ln\left(\frac{\alpha}{1-\alpha}\right) + \frac{1}{1-\rho} \left[\ln\left(\frac{p_c}{p_d}\right) + \ln\left(\frac{A_c}{A_d}\right) \right] \quad (6)$$

Table: Long-Run Elasticity of Substitution

	Dependent Variable: $\ln\left(\frac{E_{d,it}}{E_{c,it}}\right)$			
	Portugal		France	
	(OLS)	(IV)	(OLS)	(IV)
$\ln\left(\frac{P_{c,it}}{P_{d,it}}\right)$	0.8822*** (0.0029)	0.9803*** (0.0086)	1.892*** (0.0588)	2.767*** (0.1240)
Industry FE	✓	✓	✓	✓
Year FE	✓	✓	✓	✓
Observations	299,470	250,587	126,788	92,306
R2	0.74	0.88	0.24	0.31
F-test (IV only)		76,459.2		12,835.4

Significance levels: * $p < 0.1$; ** $p < 0.05$; *** $p < 0.01$

Standard errors are clustered at the firm level.

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Calibration

P_E changes simulation

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- Intuitively, keeping Y constant, following an \uparrow in P_E :

- a high σ_{cd} allows firms to buffer $\uparrow P_E$ by switching energy mix;
- a low σ_{cd} forces a stronger \downarrow overall E .

Table: Mean parameters

Country	\bar{p}_c	\bar{p}_d	$\bar{\theta}_E$	σ_{cd}	σ_{XE}
Portugal	0.015	1.200	0.042	0.95	1.0
France	0.98	0.60	0.017	2.75	1.0

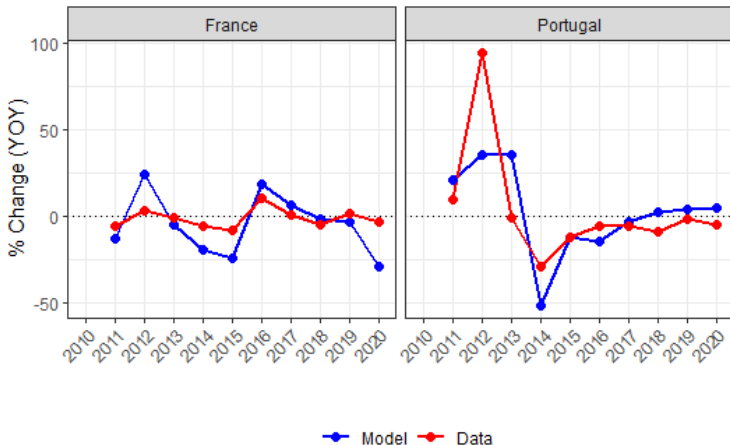
$\sigma_{XE}=1 \rightarrow$ Cobb–Douglas assumption. θ_E : energy costs. P in K€/GJ

- From (4), if $P_E \uparrow$ by $+k\% \rightarrow E$ changes by $-\sigma_{XE} \theta_E k\%$.
- PT: $\Delta E = -1 \times 0.042 \times 10\% = -0.42\%$. (+400% \rightarrow -16.8%)
- FR: $\Delta E = -1 \times 0.017 \times 10\% = -0.17\%$. (+400% \rightarrow -6.8%)

Calibration

Changes in E_d shares

Yearly % change in dirty energy by Country



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Forecast

E_d shares

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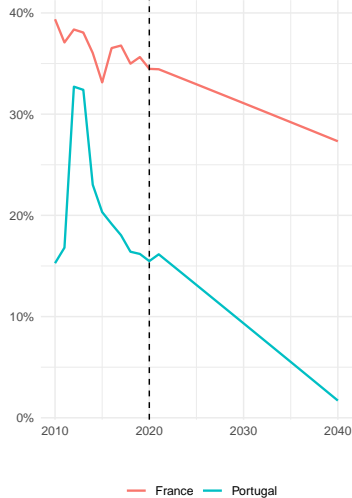
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Simulation dirty and clean energy YOY'



Share of dirty energy



Technical change bias

Market size vs price effects

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Next steps; references

- Technical change literature relates ρ to innovation bias:
 - Market size: innovation towards abundant and cheaper energy ($\sigma_{cd} > 1 : E_c, E_d$ substitutes)
 - Price effects: innovation towards more expensive energy source ($\sigma_{cd} < 1 : E_c, E_d$ complementarity)
- Following [Jo, 2024](#), plug σ_{cd} in (5) to calculate technical change bias, $\frac{A_c}{A_d}$, and relate to price ratio, $\frac{P_c}{P_d}$.

Technical change bias

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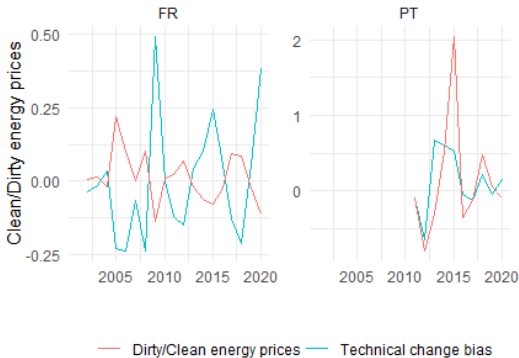
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Technical change bias and dirty to clean ratio Technical change bias based on elasticity estimates



- When $\frac{P_d}{P_c}$ increases ($P_d > P_c$), $\frac{A_c}{A_d}$ decreases ($A_d > A_c$) (FR)

■ Opposite in PT

Policy implications

Limitations

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- 1 Increasing $\frac{P_d}{P_c}$ (e.g., via carbon taxes) has a lower impact
 - in countries with higher σ_{cd} firms can relocate energy inputs (FR);
 - lower σ_{cd} forces firms to reduce E and improve efficiency (PT).
- 2 Direction of innovation can amplify price ratio effects in the long-run.
- 3 Limitations/next steps:
 - Different σ_{cd} by industry and firm-size (Jo, 2024)
 - Endogenous elasticity substitution (VES vs CES) matters (i.e., σ_{cd} varies across years) (Jo and Miftakhova, 2024)

Box 1: CompNet-OECD³ collaboration

To what extent environmental policies influence firm-level relative fuel prices

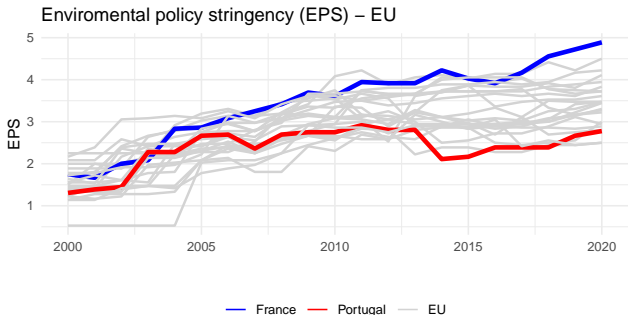
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- Sectoral energy mixes stay stable despite stricter EPS.
- We examine the impact of environmental policies on firm-level relative fuel prices.

³With Fatih Ozturk, Filiz Unsal - OECD

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Specification

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- Our initial specification includes

$$\frac{P_{i,t}^d}{P_{i,t}^c} = \beta EPS_t \times \frac{EI_{i,t_0}^d}{EI_{i,t_0}^c} + \theta_s \times \delta_t + \epsilon_{i,t} \quad (7)$$

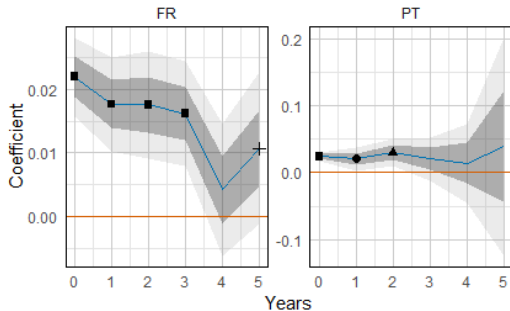
- Unobservables impact firm prices \rightarrow EPS \rightarrow simultaneity (Benatti et al., 2024)
 - Attenuate it by interacting EPS with energy intensity ratio at firm-level at time t_0 :
 - Interaction creates firms' ex-ante exposure to changes in EPS
- Firms' tend to delay their reaction to EPS; we capture it via
 - local projection approach à la Jordà, 2005 with a horizon of five years.

Box 1: CompNet-OECD collaboration

Initial results

EPS impact on Dirty/Clean energy prices ratio (log-log)

Local projections



● * ▲ ** ■ *** + . NA

- Similar coefficients (about 0.02), no precision in PT.
- Cumulative response of about 0.6% for a \uparrow 10% in EPS

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Energy prices and use: decomposition and concentration

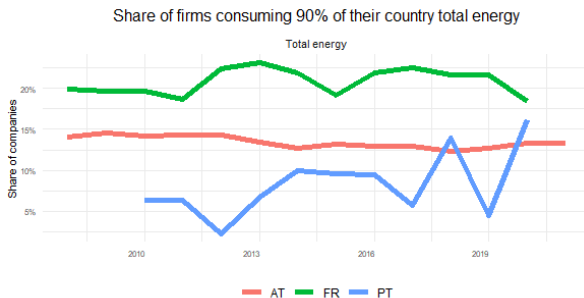
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- About 15% of the firms consume up to 90% of their countries' total energy

⁴With Sellner, R., Reinstaller, A. Austrian productivity board (OeNB)

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Energy prices and use: decomposition and concentration

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- These 'mega-consumers' pay lower energy prices⁵ have more employees, turnover, and energy costs, and are much more energy efficient.

Firms consuming 90% of country energy vs rest firms - comparison

group	Country	% firms	E Price	Empl	Turnover	E costs	L costs	Clean eff	Dirty eff
E	FR	0.23	0.67	5.13	6.2	2.86	0.76	4.25	6.87
E	PT	0.08	0.4	7.3	7.26	1.86	1.2	18.04	7.26
<i>E_{clean}</i>	FR	0.26	0.75	5.27	6.39	2.42	0.77	4.56	3.72
<i>E_{clean}</i>	PT	0.1	0.52	6.09	6.41	1.36	1.26	16.5	2.3
<i>E_{dirty}</i>	FR	0.2	0.75	4.25	4.92	2.83	0.78	2.97	8.07
<i>E_{dirty}</i>	PT	0.11	0.02	8.47	9.69	1.75	1.18	3.53	6.4

⁵E.g., FR mega-consumers pay about 33% less in energy, column 4.

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- NZE and price signaling:
 - Document time-varying (VES) micro elasticities of substitution between energy inputs;
 - recover macro elasticities from micro ones
- CompNet-OECD collaboration:
 - Fine-tune specifications;
 - Use tested IV with LP;
 - Test DiD policy in FR
- Energy-use by product : presented at the last TSI training.
 - First results in FR compared to CBAM values;
 - Expand to other countries and test energy shocks.

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Thank you!
Q & A

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References II

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