Carbon Prices and the Skill Premium

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The views expressed here are those of the authors, and not necessarily those of the Norges Bank.

Climate policies and Firms

Firms must comply with climate policies for the foreseeable future

- Which climate policy & at which intensity?
- Internalize negative externalities ⇒ Lower carbon emissions
- Concerns: Economic activity, pass-through on firms' stakeholders

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We study how higher EU ETS carbon price affects workers

- Consequences for employees are important for the welfare and firm performance
- Being a market-based policy, ETS allows firms to use different margins of adjustment
- Ex ante, the effect is not obvious!

Price shock: A regulation change that reduces the supply of emission permits

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 - → Two channels interact with each other
- 4. No effects on hiring/separation

What we know so far

• Climate policies: Carbon tax, hard limits, cap-and-trade

<u>Firm behavior</u>: Decline in emissions without a worsening in performance (Martin et al. 2014, Calel&Dechezlepretre 2016, Marin et al. 2018, Bolton et al. 2023, Dechezlepretre et al. 2023, Colmer et al. 2024)

<u>Labor markets</u>: Restrictions on emissions may reduce labor demand (Walker 2013, Martin et al. 2014, Vona et al. 2018, Azevedo et al. 2023)

→ Document the effects of carbon price on wages and underlying channels

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 - ightarrow Document the effects of carbon price on wages and underlying channels
- Determinants of wage differences among workers and firms (Acemoglu 1998, Autor et al. 2003, Acemoglu et al. 2012)
 - ightarrow Carbon prices may influence these differences due to skills and policy design
 - \rightarrow Importance of the design of the carbon market

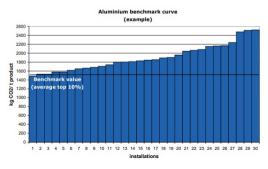
The EU ETS is a cap-and-trade program

- The EU sets an annual emission amount and issues allowances accordingly
 - \rightarrow 40% of emissions in the EU
 - \rightarrow Phase 1 (2005-2007), Phase 2 (2008-2012), Phase 3 (2013-2020), Phase 4 (2021-2030)
- Phase 3: Single, EU-wide cap on emissions in place of the previous system of national caps
- Main participation criteria: Installation's thermal input capacity of more than 20 MW
- Firms submit their allowances by April 30 for the previous year
 - → Participants can keep or sell their unused permits
 - ightarrow Not submitting leads to a fine of 100 euros per tonne + allowance

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- Carbon leakage: Sectors exposed to carbon leakage receive higher free allowances.

Share of free allocation calculated based on benchmarks per sector	2013	2014	2015	2016	2017	2018	2019	2020
Electricity production	0%	0%	0%	0%	0%	0%	0%	0%
Industry sectors	80%	72.9%	65.7%	58.6%	51.4%	44.2%	37.1%	30%
Industry sectors deemed exposed to carbon leakage	100%	100%	100%	100%	100%	100%	100%	100%

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- Carbon leakage: Sectors exposed to carbon leakage receive higher free allowances.
- Linear reduction reduces total allowances every year

Year	2013	2014	2015	2016	2017	2018	2019	2020
Linear reduction factor (electricity generators)	1	0.9826	0.9652	0.9478	0.9304	0.9130	0.8956	0.8782
Cross sectoral correction factor (non-electricity generators)	0.9427	0.9263	0.9098	0.8930	0.8761	0.8590	0.8417	0.8244

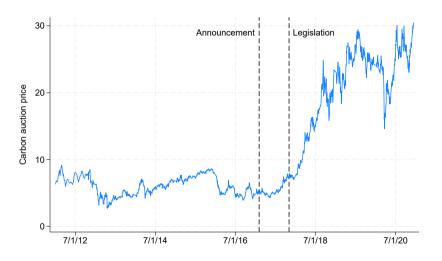
Data

- ETS, labor market, firm characteristics, individual characteristics
 - 1. ETS transactions log: Carbon emissions, free allowances (EUTL)
 - Labor market: Wage components, hours obtained from employee-employer matched data (CBS)
 - 3. Firm characteristics: Balance sheet, income statement, sector (CBS)
 - 4. Individual characteristics: Education, age (CBS)
 - 5. We manually match EUTL variables with CBS variables
- 2014-2020 (Phase 3), annual

New Rules in 2017

- The carbon price until 2017 was deemed to be too low to incentivize the firms (€5)
 - ightarrow Low economic activity & structural oversupply
- In 2015, the Market Stability Reserve (MSR) is announced to start operations in 2019
 - ightarrow MSR's main purpose is to absorb the oversupply of allowances
- In Feb 2017, the EU increases the MSR's absorption capacity significantly
 - ightarrow Absorption of 24% of unused allowances instead of 12% if unused is above a threshold
 - → Permanent cancellation of allowances
 - ightarrow Legally introduced in Nov 2017
- These changes have increased the carbon prices in ETS substantially!

Carbon Prices



Conceptual Framework

• Firm's profit

$$p \times f(A_f, L_{ft}, K_{ft}) - w_{ift}L_{ft} - p_c \times (C_{ft}(A_f) - F_s)$$

• Nash bargaining determines the wages, yielding:

$$\max_{w_i} (w_i - \omega_i)^{\beta} (V_j(\mathbf{p_c}) + V_i(\mathbf{p_c}) - w_i)^{(1-\beta)}$$

where w_i : salary; ω_i : outside option; V_j : MS to all workers; V_i : MS specific to worker i (MS: match surplus)

Straightforward to show that

$$\frac{\partial w_i}{\partial V_i} > 0; \quad \frac{\partial w_i}{\partial V_i} > 0; \quad \frac{\partial w_i}{\partial V_i} \Rightarrow \omega_i \uparrow$$

- 1. p_c can increase OR decrease firm surplus, hence wages
- 2. Workers related to carbon efficiency can have higher wages
 - →Especially workers with better outside options

Exploit the increase in carbon prices in a matched difference-in-differences setting:

$$y_{it} = \beta ETS_i \times Post_t + \gamma_i + \delta_t + \epsilon_{it}$$

Event-study version:

$$y_{it} = \sum_{\tau=-3}^{3} \beta_{\tau} ETS_i \times \mathbb{1}(t = t^* + \tau) + \gamma_i + \delta_t + \epsilon_{it}$$

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Matching is done at two levels:

- Worker level: matching on two lags of log(wage), age, part-time, tenure, and gender dummies
- Firm level: matching on industry, log(# employees), and profits per worker

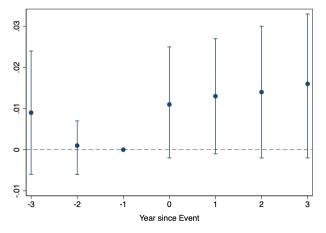
Balance Test

- ETS firms are larger and more profitable, workers are older and earn more
- Differences insignificant after matching

Sample:		Full Sample		Matched Sample			
Variable	Control	Treated	Difference	Control	Treated	Difference	
Age_{t-1}	42.82	44.395	1.575	45.166	45.173	0.007	
	(0.125)	(0.408)	(0.426)	(0.218)	(0.272)	(0.348)	
$log(Wage_{t-1})$	10.302	10.796	0.494	10.84	10.876	0.036	
	(0.020)	(0.040)	(0.045)	(0.035)	(0.026)	(0.044)	
$log(Wage_{t-2})$	10.257	10.756	0.498	10.804	10.833	0.029	
	(0.020)	(0.037)	(0.042)	(0.032)	(0.025)	(0.040)	
log(Size)	5.461	8.382	2.921	6.286	6.248	-0.038	
	(0.133)	(0.330)	(0.355)	(0.152)	(0.127)	(0.198)	
Profits/Employment	20.33	48.759	28.429	79.800	68.625	-11.175	
	(1.255)	(13.779)	(13.798)	(12.304)	(11.806)	(17.028)	
N	2,868,897	162,543	3,031,440	23,001	23,001	46,002	

Baseline Effect

- Virtually no effect on wages
- Coefficients small in magnitude and insignificant



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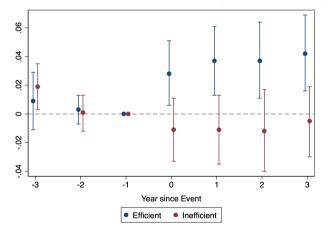
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Carbon Price Shock, Cash Flows, and Wages

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- We sort firms in quartiles, going from the firms with highest surplus (efficient) to the firms with the highest deficit (inefficient)

Sorting by Efficiency - Event-Study Results

- Fairly large, positive effect on wages for efficient firms
- Conversely, inefficient firms experience negative effects (albeit insignificant)



Sorting by Efficiency – Results

• Significant effects on wages and hourly wages; marginally significant for earnings, but only for efficient firms

Sample:	All				Efficient				Inefficient			
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)
ETS×Post	0.009 (0.006)	0.009 (0.008)	928.0* (525.3)	0.006 (0.004)	0.029*** (0.010)	0.025** (0.010)	1145.0* (623.7)	0.001 (0.007)	-0.012 (0.010)	-0.024 (0.017)	-436.9 (1246.1)	-0.001 (0.007)
Observations R ²	313,316 0.932	313,316 0.846	322,014 0.844	322,014 0.399	82,366 0.935	82,366 0.863	84,350 0.865	84,350 0.400	75,607 0.933	75,607 0.840	77,812 0.845	77,812 0.390
Dep. Var.	$log(\frac{Wage}{Hours})$	log(Wage)	Earnings	Employed	$log(\frac{Wage}{Hours})$	log(Wage)	Earnings	Employed	$log(\frac{Wage}{Hours})$	log(Wage)	Earnings	Employed

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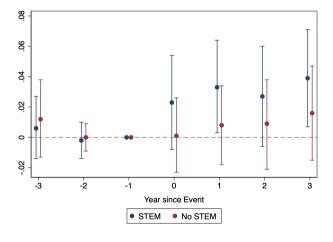
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- The increase in their "market value" is likely to be reflected in higher wages

Anecdotal Evidence



Education – Event-Study Results

- Positive effect of shock on wages only for STEM workers
- Small and insignificant for all the others

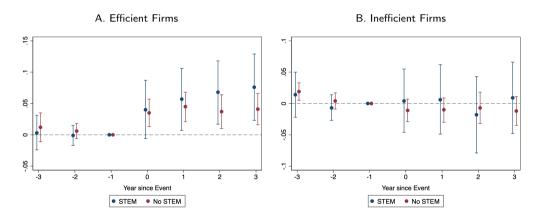


Education vs Firm Efficiency

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- No: Effects are distinct

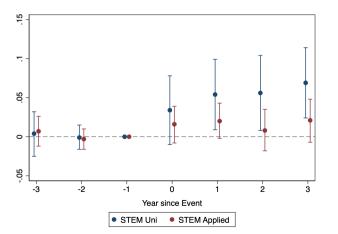


Education - Zooming in on STEM Workers

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- Between STEM workers, we can also distinguish between graduates from research and technical universities
- Results larger for the former



Education – Results

- Null effects for Non-STEM graduates, similar to workers with no degrees at all
- Only STEM workers benefit from increase in carbon price

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
ETS × Post	0.010 (0.006)	0.014 (0.011)	0.028 (0.015)	0.006 (0.010)	0.008 (0.011)	0.026** (0.012)	0.050** (0.018)	0.012 (0.010)
Observations	98,779	80,167	32,435	47,732	49,332	30,835	12,261	18,574
R^2	0.905	0.912	0.907	0.906	0.911	0.916	0.912	0.908
Sample	No Degrees	Some Uni	Uni	Appl. Sc.	No STEM	STEM	STEM Uni	STEM Appl.

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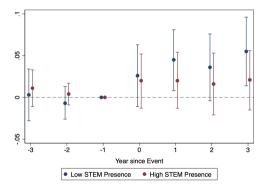
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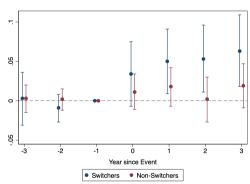
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 - Intuition: Threat of quitting more credible

Outside Options - Results

- Distinguish workers between:
 - A. High vs low density of STEM graduates
 - B. Switchers vs non-switchers
 - A. Sorting by Density of STEM Graduates



B. Job Switchers vs Non-Switchers



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 - 1. Look at changes in the fraction of STEM workers (columns 1 and 2)
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- No significant effects
- ullet Suggests that, in the short run, labor supply is quite inelastic o large wage effects

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Observations R ²	1,926 0.944	1,926 0.952	294,174 0.101	278,496 0.144
Dep. Var.	STEM Total	STEM Hr. Total Hr.	STEM Hire	STEM Sep.

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