

# The causal impact of the EU ETS on Emissions



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*joint with Jonathan Colmer, Mirabelle Muuls and  
Ulrich Wagner*

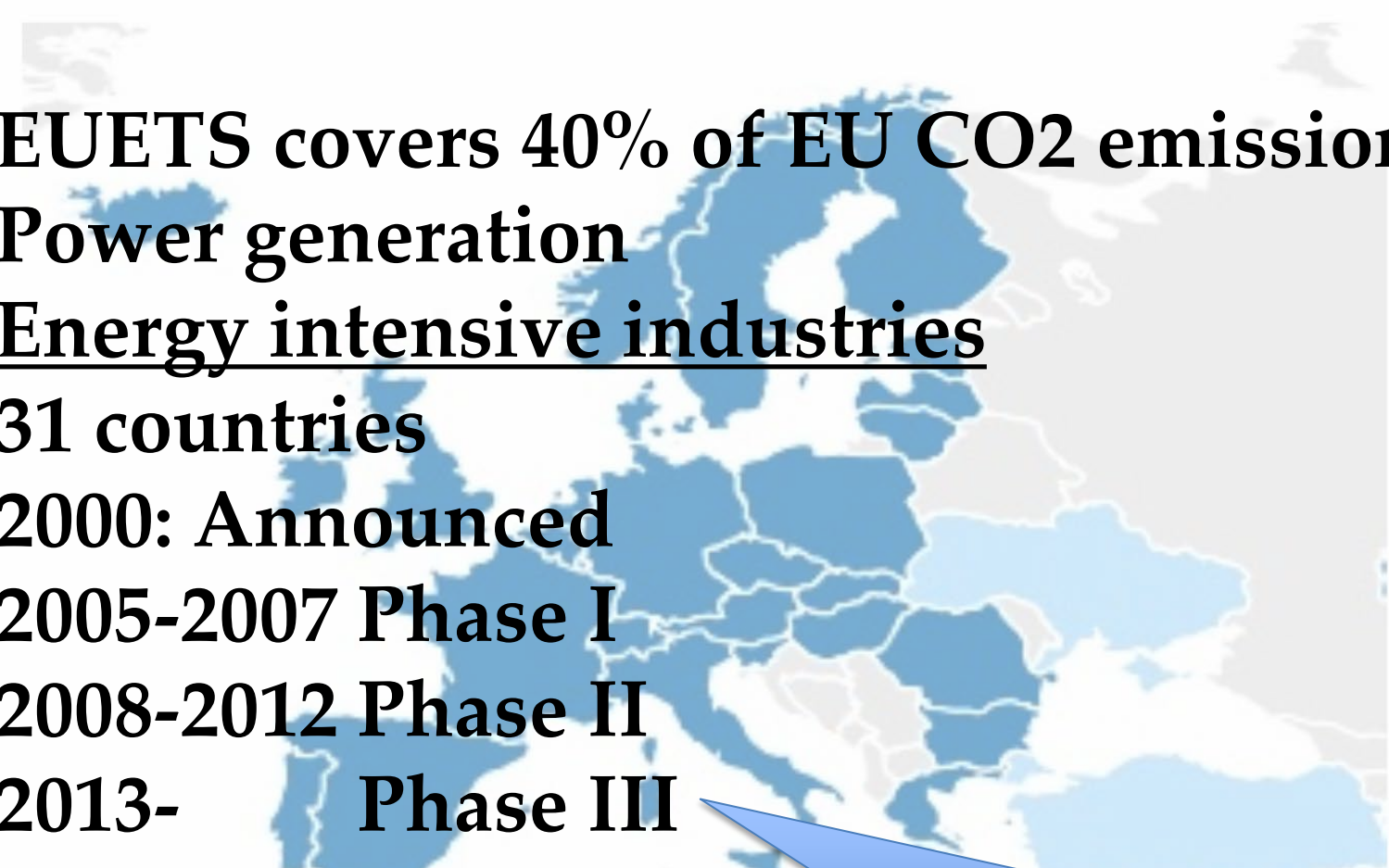
Imperial College  
London  
BUSINESS SCHOOL



Grantham Research Institute on  
Climate Change and  
the Environment

 CENTRE *for* ECONOMIC  
P E R F O R M A N C E 

# The greatest experiment to date

- 
- EUETS covers 40% of EU CO<sub>2</sub> emissions
  - Power generation
  - Energy intensive industries
  - 31 countries
  - 2000: Announced
  - 2005-2007 Phase I
  - 2008-2012 Phase II
  - 2013- Phase III

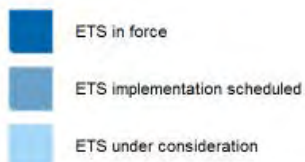
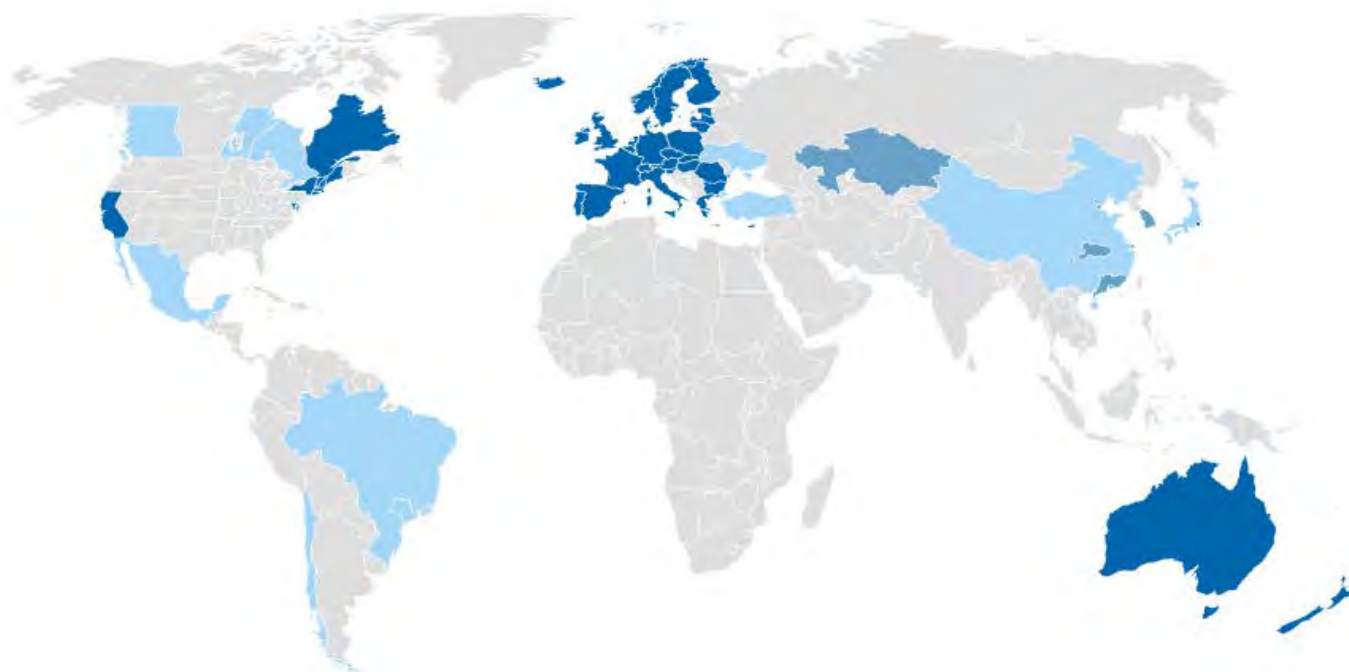
Time to ask what has been achieved?



# Even more experiments under way



Updated on: 7 December 2012



[www.icapcarbonaction.com](http://www.icapcarbonaction.com)

Developed in cooperation with **ECOFYS**

# Diverging views on Carbon Trading

*"The Administration is developing a comprehensive energy and climate change plan to (...) address the global climate crisis, and create new American jobs that cannot be outsourced. (...) This program will be implemented through a cap-and-trade system (...)."*

Executive Budget Office of the President, 2009.



*"I do not believe in a cap-and-trade program. (...) It loses jobs for Americans, and ultimately it won't be successful, because industries that are energy-intensive will just get up and go somewhere else."*

Mitt Romney, Business Man  
Former GOP Presidential Candidate,  
October 2011, Pittsburgh



*"The current proposal about Carbon Dioxide emissions would damage Germany's competitiveness in an unacceptable way and is not practicable".*

Gerhard Schroder, Gazrom  
Former German Chancellor,  
June 2002



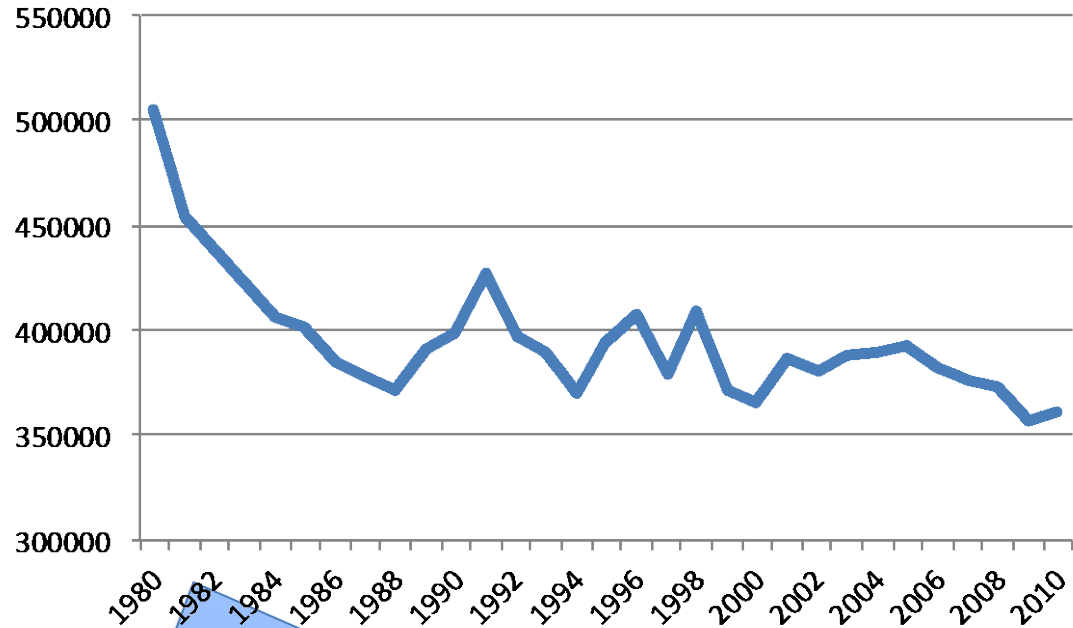
# Is there any effect?

- On emissions?
- Employment?
- Competitiveness?
- (Clean) Innovation?
- Growth?

# ETS effect on emissions

- By definition the EU ETS ensures that emissions of regulated firms do not exceed cap
- Hence if the cap is contracting/binding emissions must reduce
- However: this does not tell us by how much emissions have reduced due to the presence of the ETS
- Emissions might have reduced anyways

# Aggregate figures for France



Kt of CO2

Source: Worldbank





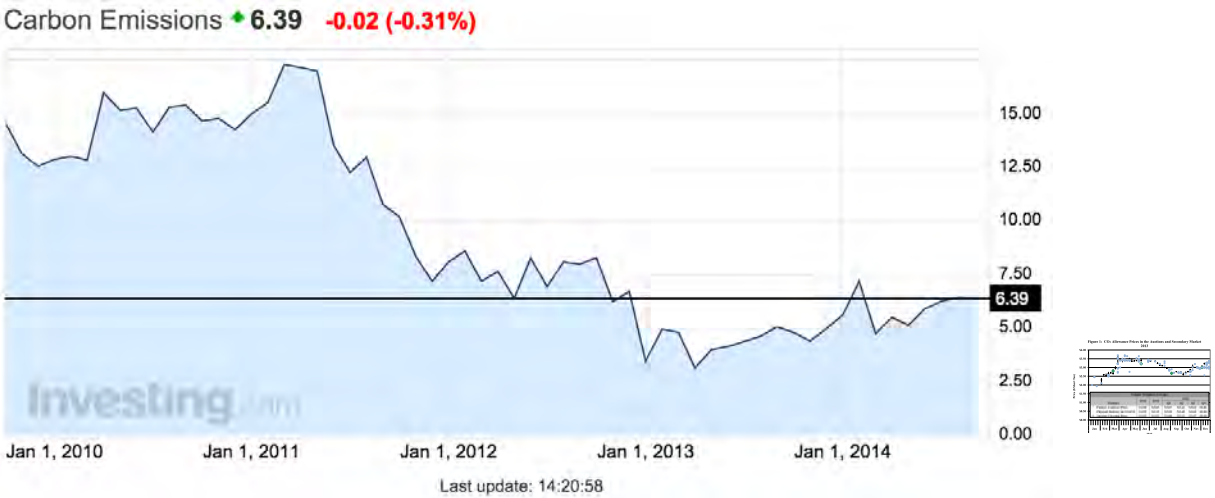
# ETS – much to ado about nothing?



Source: Climate Economics Chair from BlueNext and ICE ECX Futures

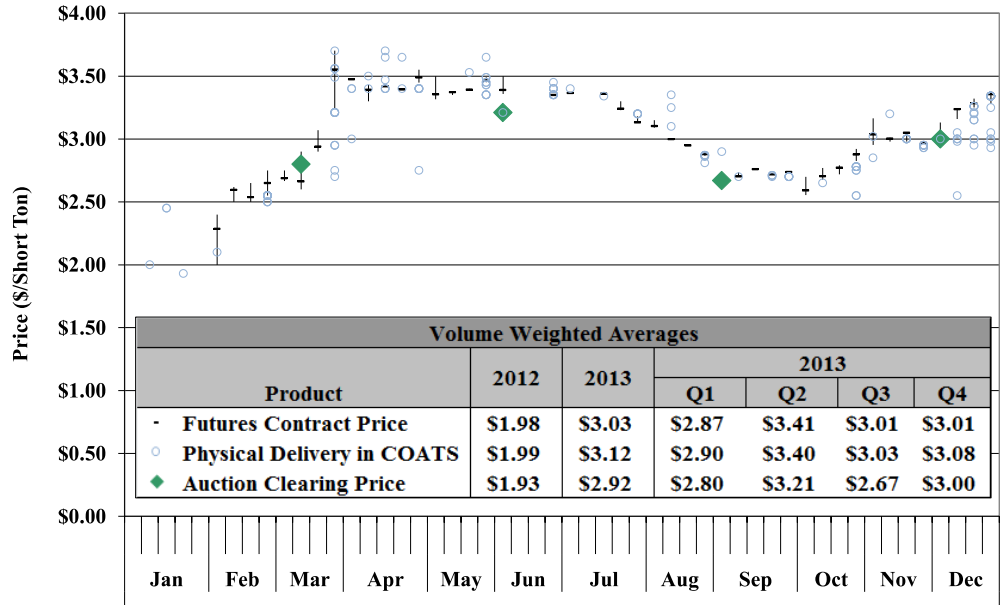


# ETS – much to ado about nothing?



RGGI

Figure 1: CO<sub>2</sub> Allowance Prices in the Auctions and Secondary Market 2013



# Why would we expect any effect?

- Below we will see that we find ETS effects primarily after 2008; when price drop
- Counter intuitive?
- Capital + Phase II  $\Rightarrow$  Higher future price expectations (Management survey suggest average price expectation of £40 for 2020)
- Another possibility: Reduced uncertainty  $\Rightarrow$  value of option to wait reduces

# Having said that....

- Higher future price expectations are not a sufficient condition for emission reductions today
- Too high prices in the future could prompt future plant exit and reduction in current investment
- Might lead to increased emissions today



# Investment options today



# A quick summary

Using data for France we find

- Negative effect on emissions: ~15%
- Driven mainly by improvements in efficiency (reductions in carbon intensity)
- However: We also find a negative impact on employment?
- Does this mean leakage? Probably not
- Effect mainly after 2008 (i.e. Phase 2)

Data ends  
in 2010  
(for now)

# Previous work - Emissions

- Limited number of previous studies
- Aggregate data
- Baseline derived from interpolating pre policy trends
- Most work only for Phase I
- Ellerman Buchner: -2.4% to 4.7% emission reduction 2005-6
- Ellerman, Convery & de Perthuis: -3% in Phase I
- Ellerman & Feilhauer (2008) for Germany: -6.3% industrial emissions, -4.1% power sector (average -5%)
- Anderson & DiMaria (2011, *ERE*): -2.8% EU wide

# Previous work – Other outcomes

Economic performance and competitiveness:

- Evaluation studies at firm level: Abrell, Ndoeye & Zachmann (2011 WP); Chan, Li & Zhang (2013 Energy Policy), Bushnell, Chong & Mansur (2013 AEJ:EP).
- Little evidence of adverse impacts on revenues, profits, employment

Matching + Diff-in-diff to identify causal impact of cap & trade

- Caelel & Dechezlepretre (201x ReStat): impact of EU ETS on clean patents



# Parallel work

Wagner & Petrick for Germany:

- CO<sub>2</sub>↓ ~20% in Phase2
- However: no effect on employment

# **This paper/project**

- **First study to compare the change in emissions between regulated and non-regulated facilities over the introduction of the ETS (DiD)**

## **Two problems**

- 1. Data for both ETS and non ETS plants from before and after ETS**
- 2. Are there comparable non ETS plants?**

# Structure

- Data
- Details on treatment & Econometric strategy
- Main results
- Leakage
- More (non) evidence on leakage
- Further discussion

# Data

- CO2/Fuel consumption data from government business census data
- Access often difficult
- We have now access to relevant data for UK & France, Germany (probably NL & Norway)
- Today: Initial results for France
  - Unbalanced panel of ~10000 firms
  - Smaller firms are randomly sampled
  - Enquete Annuelle sur les Consommations d'Energie dans l'Industrie (EACEI)
- ETS participation information from CITL



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# The treatment



Who is covered?

- Specific capacity thresholds for different industries

Examples:

- Paper mill above 20 tonnes per day production capacity
- Power plant with rated thermal input of more than 15MW

- Based on capacity – not consumption - so firms can get out only by closing down
- Also: we base ETS id on first treatment period
- Endogeneity? Only if (some) firms changed capacity in response to ETS before Phase I
- If that happened it will probably be a downward bias

# Controls

- Size thresholds means we will never have common support in terms of size related variables
- We match instead on CO2 intensity and (2digit) sector (nearest neighbour matching)

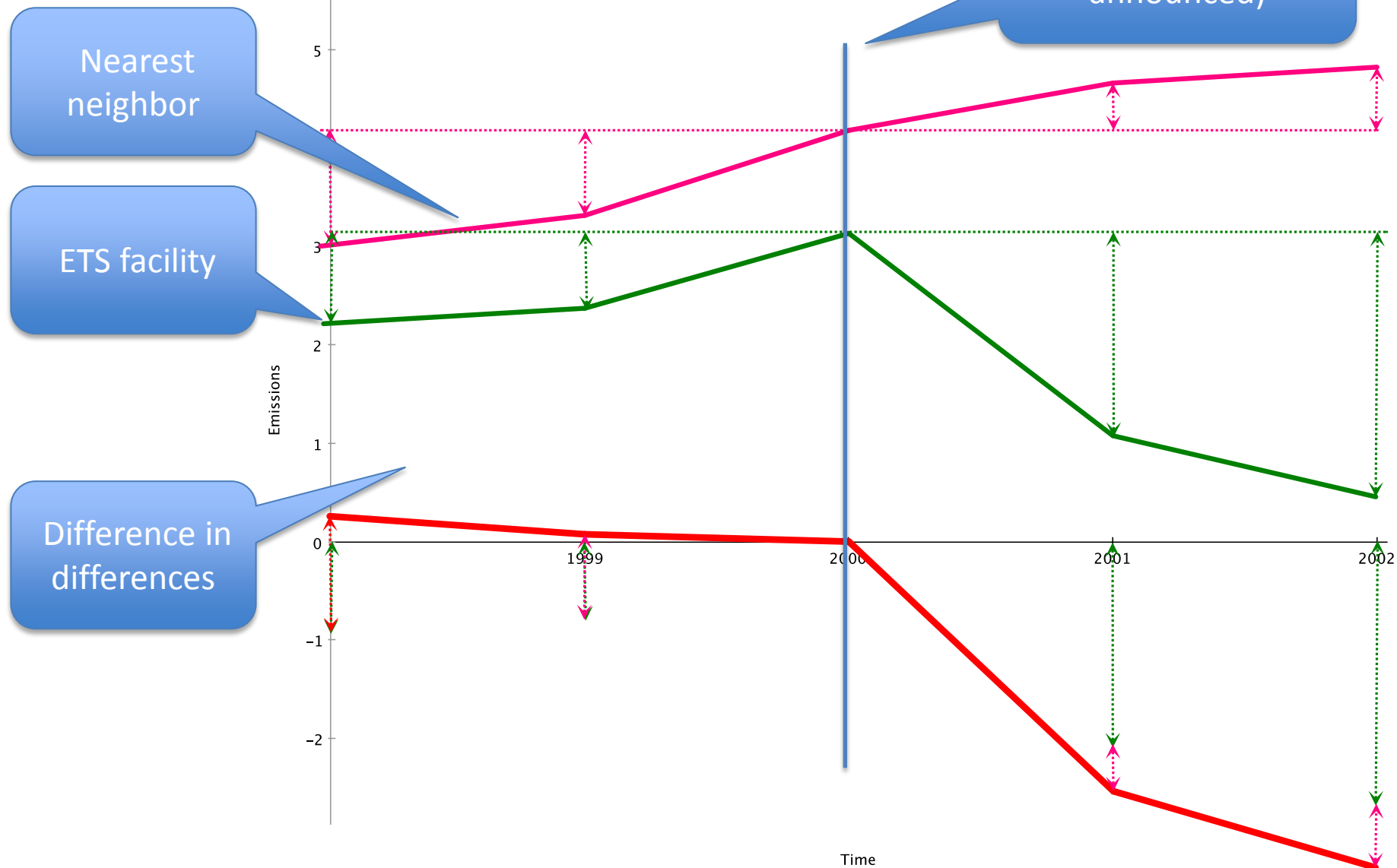


# DiD-Matching estimator

$$SATT_t = \frac{1}{\# Plants} \sum_i \left( [y_{it} - y_{i2000}] - [y_{NN(i)t} - y_{NN(i)2000}] \right)$$



# DiD-Matching estimator

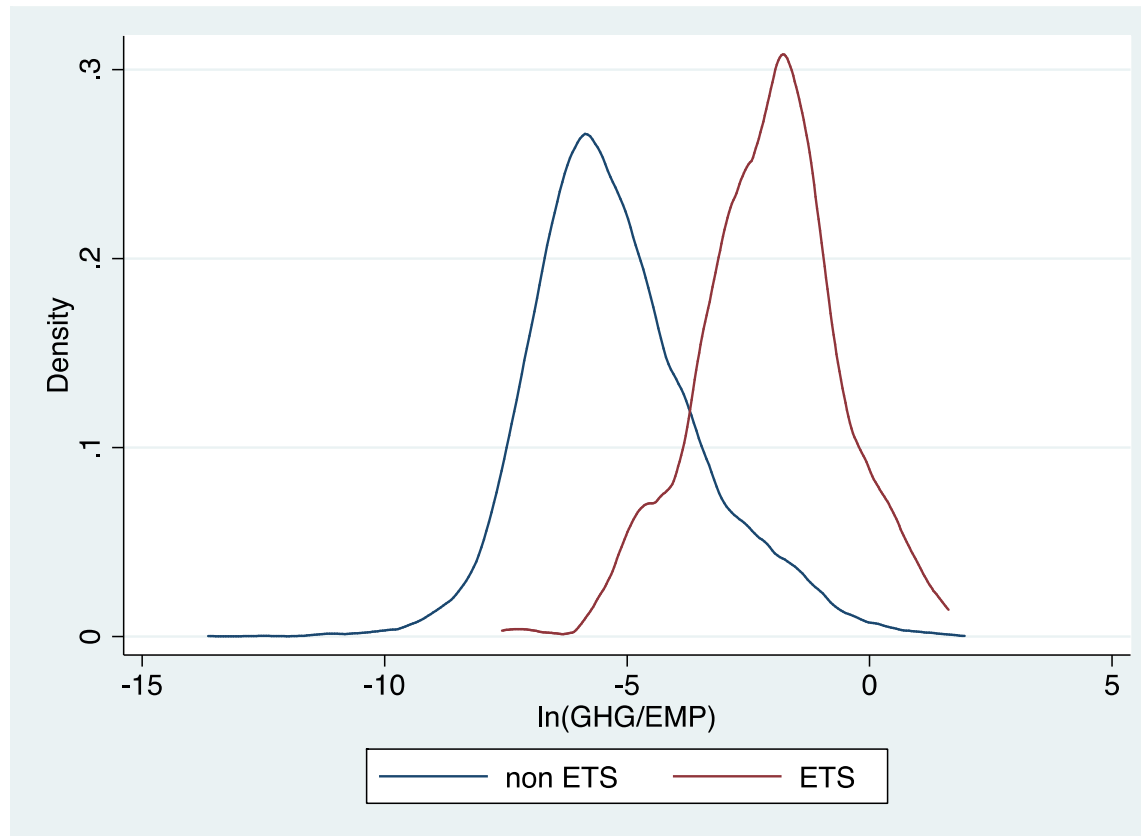


# What do we identify

- Relative effect between ETS and non ETS
- Maybe substitution between regulated and non regulated plants?
- Maybe carbon leakage?
- We can say a little bit about that by looking at multi-plant firms with plants covered and not covered

# ETS vs non ETS

- ETS plants in sample: 384
- Non ETS plants: 5,573

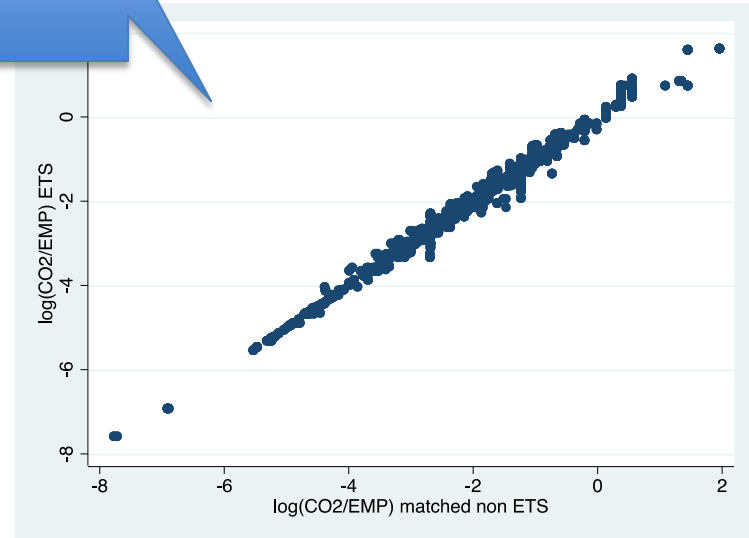
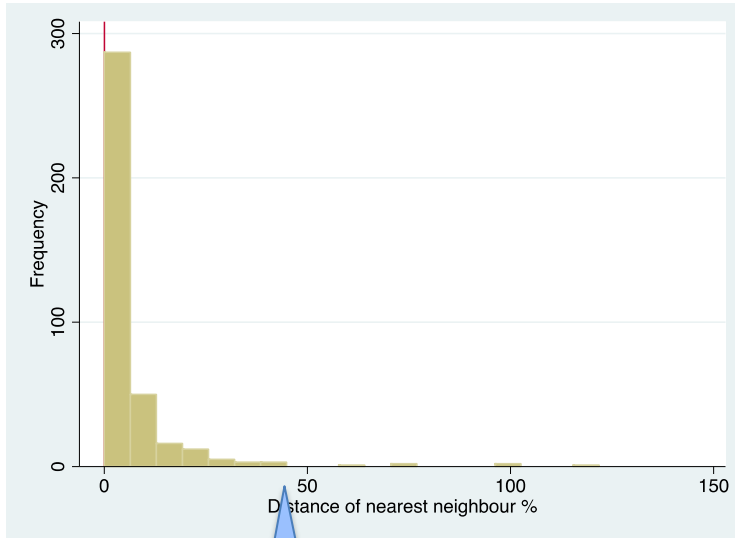


# ETS vs non ETS

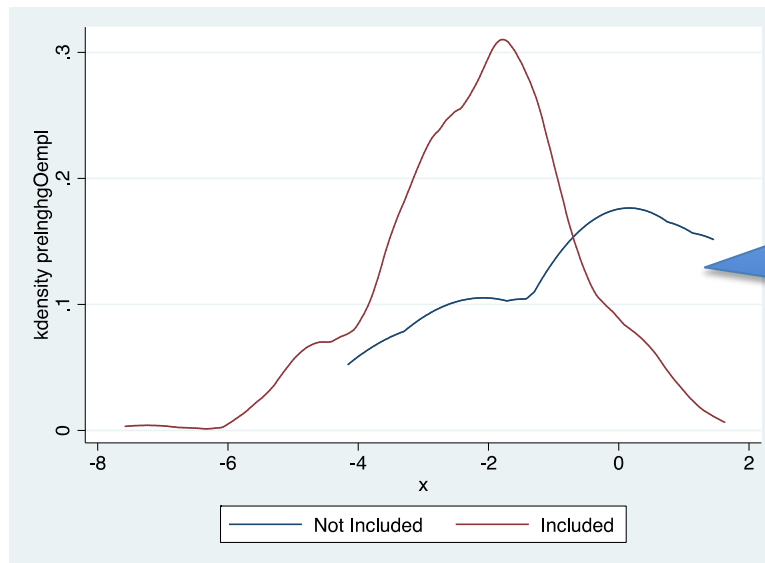


# Matching

Treated vs. NN  
GHG intensity



Distance to  
nearest neighbor:  
50% cut – off  
captures most of  
the sample



Non matched are  
within the support  
of matched

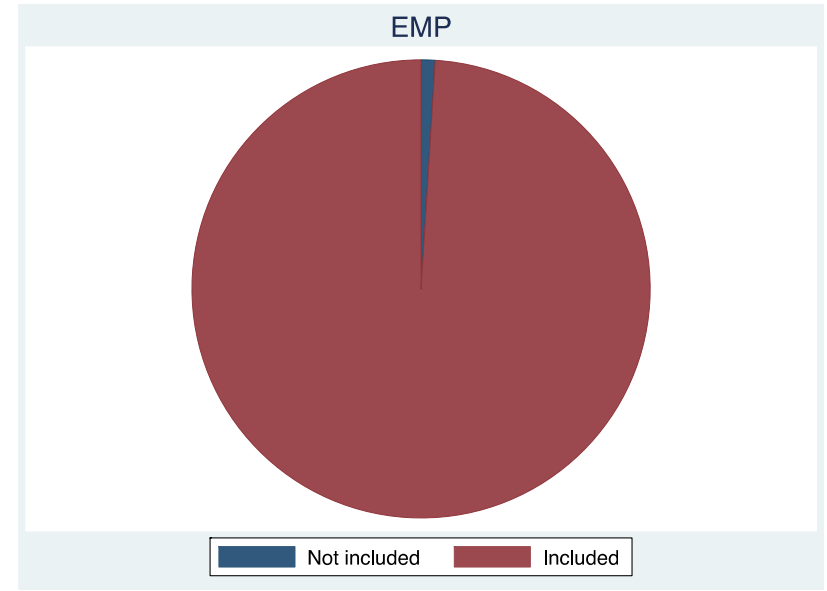
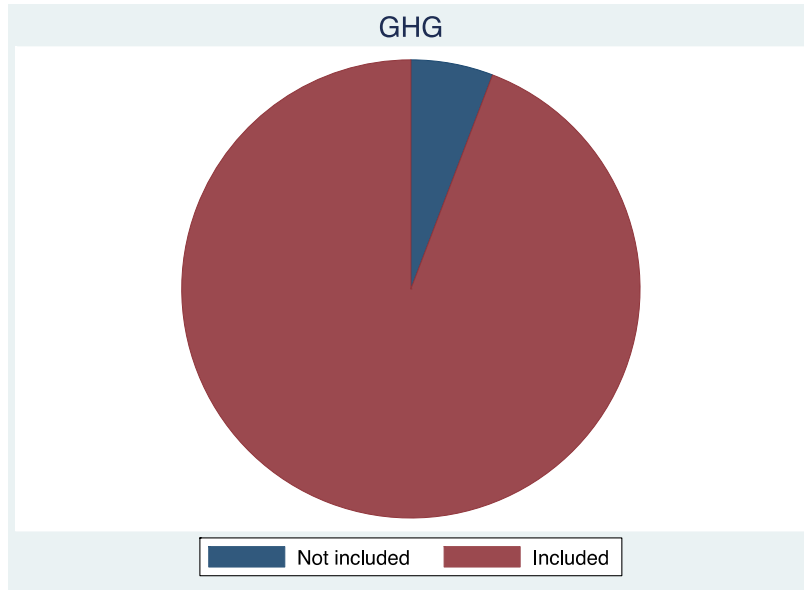
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-



# Share of GHG and EMP in matched sample



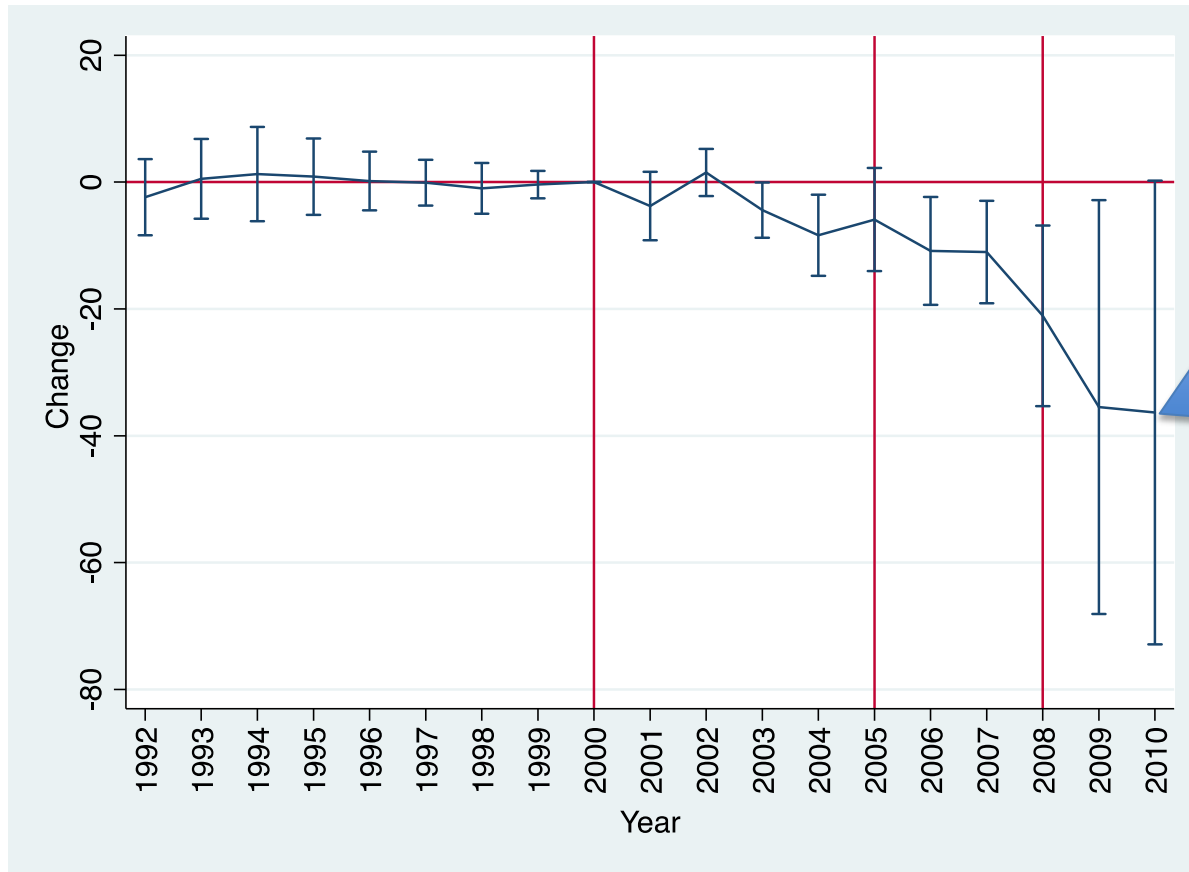
50% cut captures most  
GHG and employment

# Average impact: $\ln(\text{GHG})$



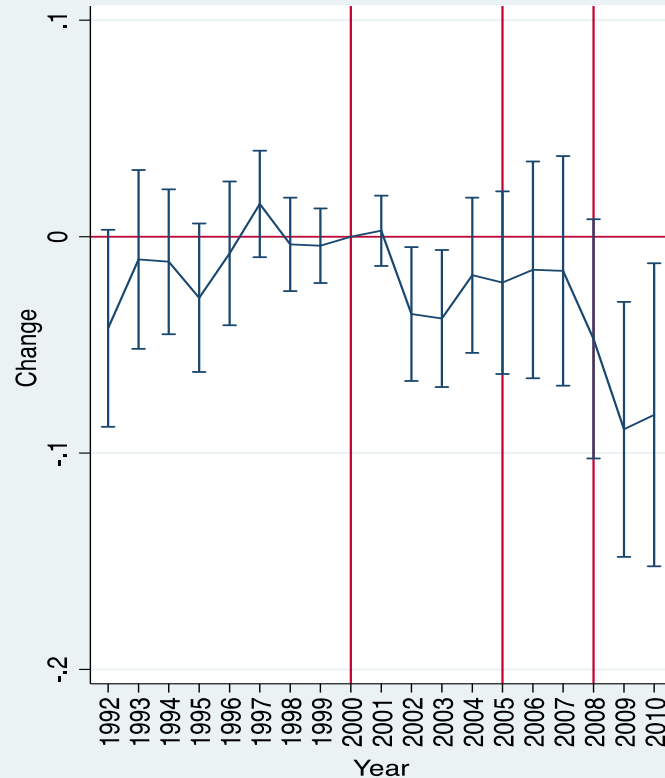
Average  
reduction of  
more than 15%

# Average impact: GHG



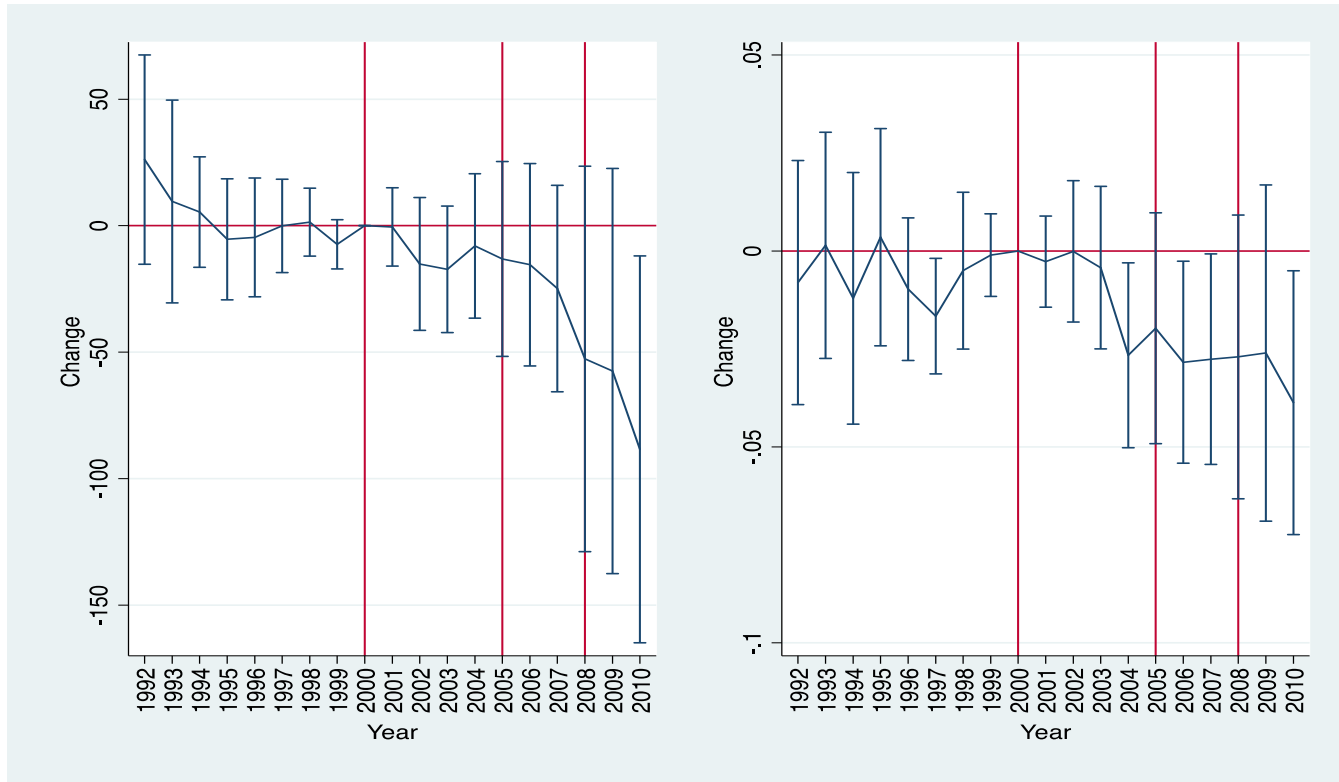
Average  
reduction of  
approx. 40,000t  
of CO<sub>2</sub>

# $\ln(\text{EMP})$ and $\ln(\text{GHG}/\text{EMP})$



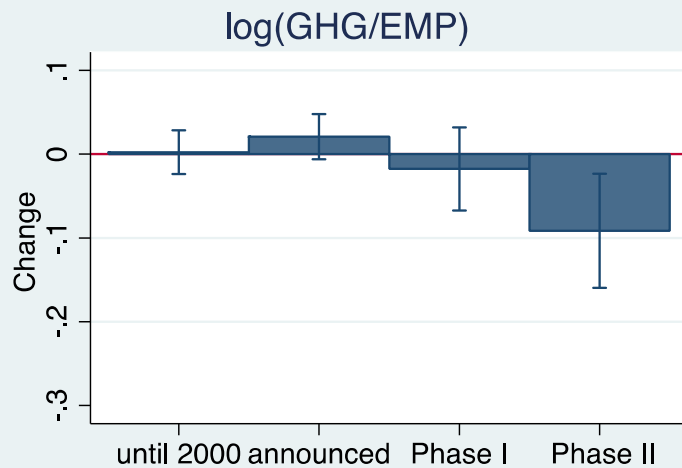
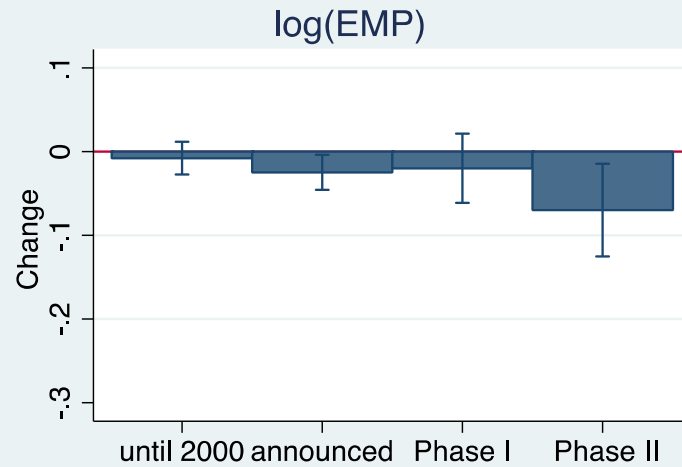
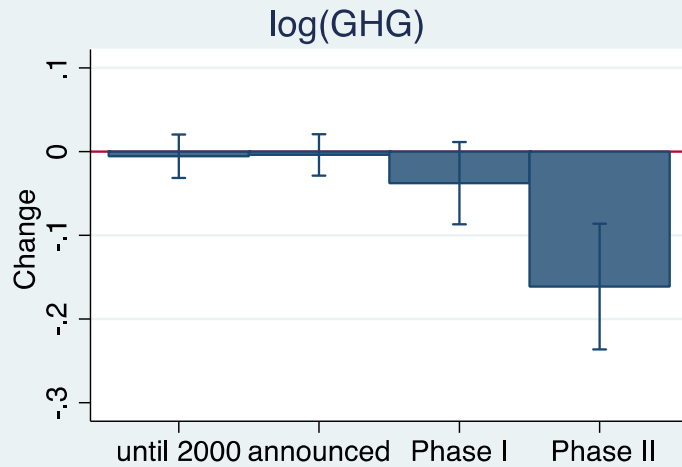
Decline in employment as well but  
GHG intensity declines nevertheless

# EMP and GHG/EMP



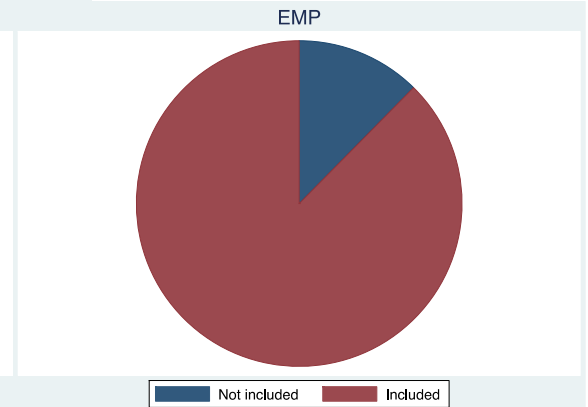
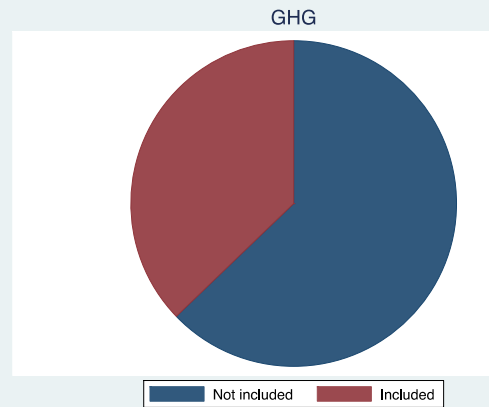
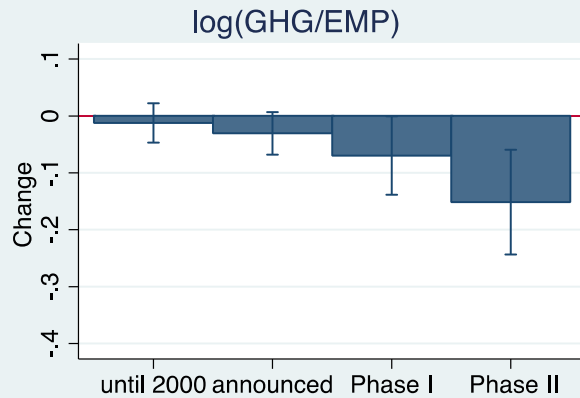
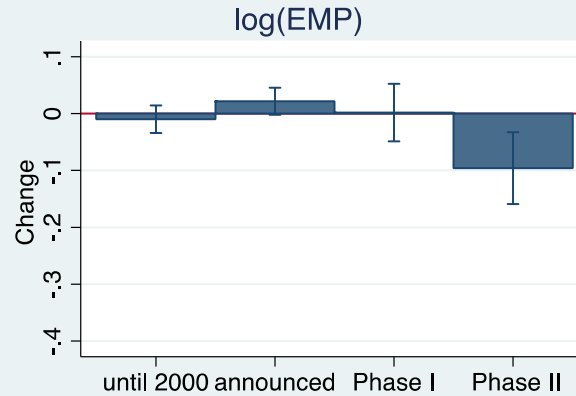
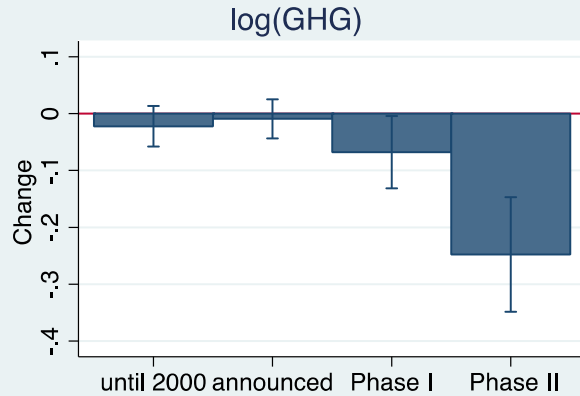
Decline in employment as well but  
GHG intensity declines nevertheless

# Summary %



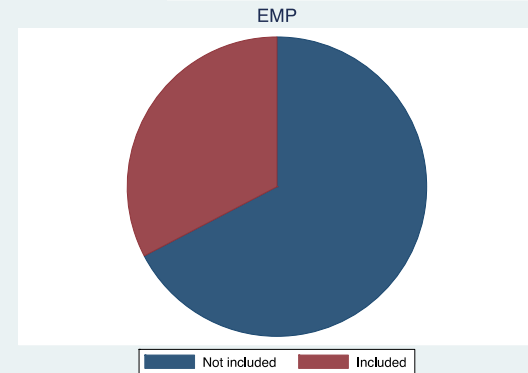
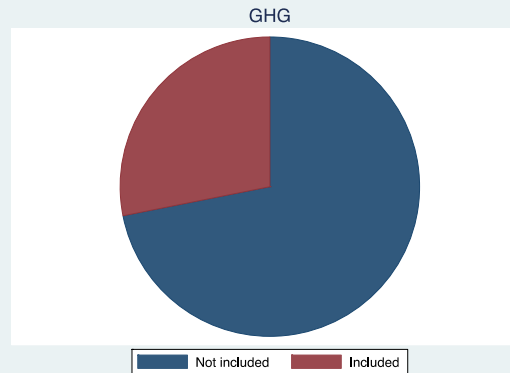
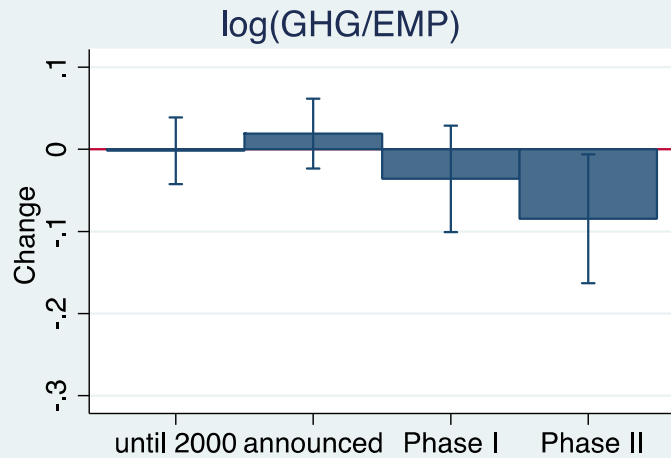
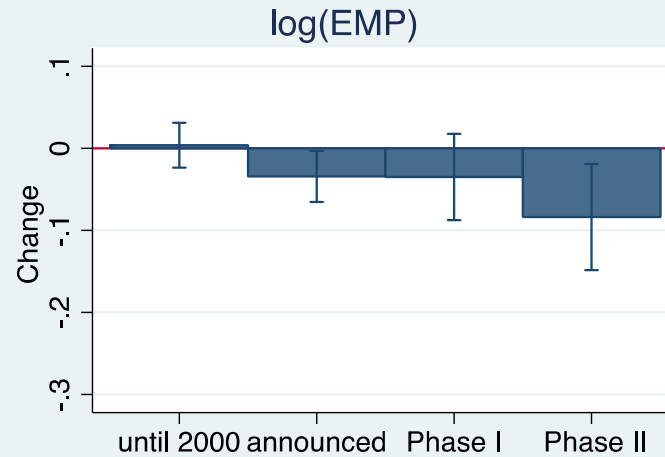
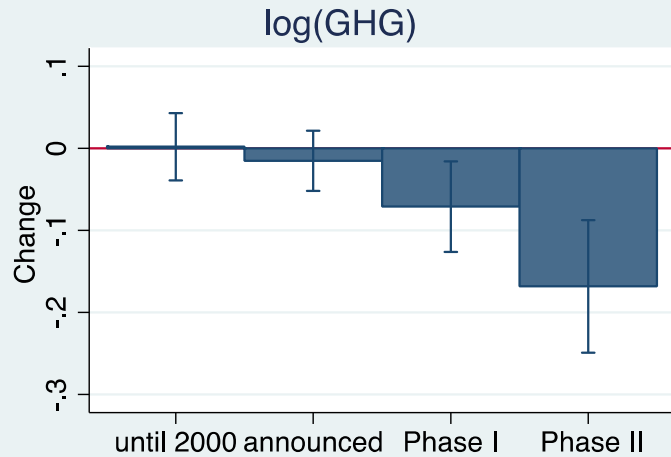
Almost 20% average  
reduction in GHGs

# Robustness – 10% NN only





# Robustness – balanced sample



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# Leakage?

Are our results due to

- Global net reductions?
- Or leakage?

We cannot assess directly

However we can provide circumstantial evidence



# Multi-plant firms and leakage

	Multiplant ETS only firms	Multplant ETS & non ETS	Single plant ETS
Plants	100	130	154
Firms	57	76	154

- For them within country leakage should be easier
- If leakage drives emission reductions we expect stronger effects for this group
- We also expect emission increases **for non ETS plants of ETS firms**



# Multi-plant firms and leakage

		(2)	(3)	(4)
		Part ETS	Only ETS	Non-ETS
<b>Panel A: GHG Emissions</b>				
<i><math>\Delta \ln(\text{GHG Emissions})</math></i>				
Pre-Announcement SATT		0.0112 (0.0287)	-0.0148 (0.0147)	0.0174 (0.0214)
Announcement Phase SATT		-0.0460 (0.0292)	-0.00610 (0.0178)	0.0180 (0.0347)
Phase I (2005-2007) SATT		-0.0506 (0.0545)	-0.0409 (0.0339)	-0.00179 (0.0709)
Phase II (2008-2010) SATT		-0.160** (0.0691)	-0.238*** (0.0643)	0.0226 (0.0648)

Only ETS plant effects  
stronger

No (significant) positive  
effect for non ETS plants in  
ETS firms



# Other indicators of leakage

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Firm level non-EU imports increase	<i>Working on it but initial results find no evidence</i>
Material shares increase	<i>Working on it</i>

## Indicators of non-leakage

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Investment increases	<i>Working on it</i>
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# Firm level

	(5) Base Year (2000)
GHG emissions ( $\Delta \ln(GHG)$ )	
Pre-Announcement SATT	0.008 (0.013)
Announcement Phase SATT	0.013 (0.017)
Phase I (2005-2007) SATT	-0.003 (0.032)
Phase II (2008-2010) SATT	-0.104** (0.043)

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# Exports?

	(1) log(Total Exports)	(2) log(Total)	(3) log(EU)	(4) log(EU)	(5) log(Non-EU)	(6) log(Non-EU)
Pre-Announcement SATT	-0.033 (0.030)	-0.034 (0.031)	-0.046 (0.030)	-0.048 (0.031)	0.007 (0.026)	0.007 (0.026)
Announcement Phase SATT	0.011 (0.008)	0.013 (0.008)	0.017** (0.008)	0.022** (0.025)	-0.000 (0.010)	-0.002 (0.011)
Phase I (2005-2007) SATT	0.017 (0.021)	0.022 (0.024)	0.028 (0.022)	0.038 (0.025)	-0.008 (0.022)	-0.012 (0.026)
Phase II (2008-2010) SATT	-0.026 (0.032)	-0.018 (0.038)	-0.007 (0.032)	0.005 (0.037)	-0.032 (0.031)	-0.030 (0.037)

Could be a sign of negative competitiveness effects





# Fuel switching?

	Coal Share	Oil Share	Gas Share	Steam Share
Pre-Announcement SATT	-0.000 (0.004)	-0.006 (0.008)	0.012 (0.009)	-0.000 (0.001)
Announcement Phase SATT	-0.014** (0.006)	-0.011* (0.005)	0.021** (0.008)	0.005* (0.003)
Phase I (2005-2007) SATT	-0.021* (0.011)	-0.023* (0.012)	0.037** (0.017)	0.007 (0.006)
Phase II (2008-2010) SATT	-0.044*** (0.014)	-0.044*** (0.016)	0.073*** (0.022)	0.008 (0.006)

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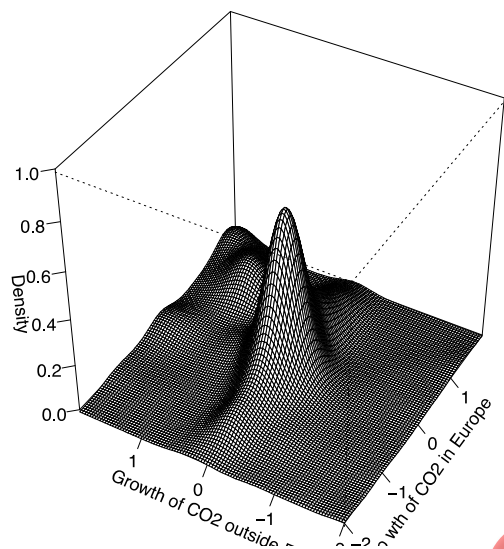
# Further evidence on leakage

- Dechelepretre, Gennaioli, Martin, Muuls (2014, Grantham), Searching for carbon leaks in MNEs:
- Data from Carbon Disclosure Project (CDP) for ~400 MNEs, 2007-2009 on carbon emissions by country
- We compare changes in emissions in EU vs non EU

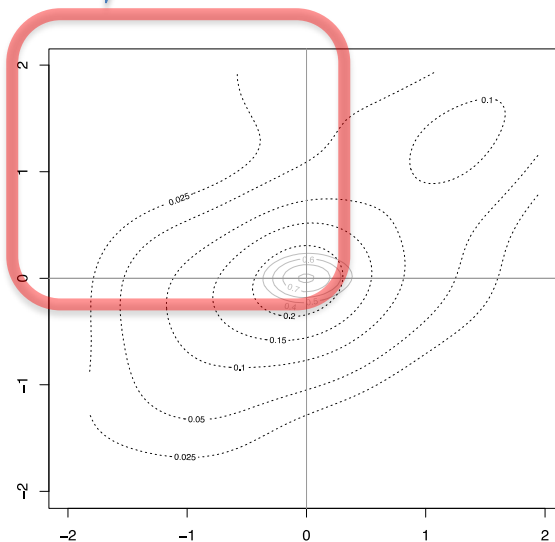


# EU vs RoW emissions

(a) Firms with positive  $\text{CO}_2$  in EU in base year



Any leaks  
here?



# Structure



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  - **More (non) evidence on leakage**
  - **Further discussion**
-



# Discussion & Triangularisation

- Martin, Muuls, de Preux & Wagner (2014, AER, EE):
- Interviews with managers approx 800 managers in 6 European countries in summer 2009
  - Open dialog but scores (1-5) capturing various aspects of business activities (Bloom van Reenen style)
  - Impact Score: Will climate policy lead to downsizing ?
  - Innovation Score: Are you doing R&D to develop “clean” products?



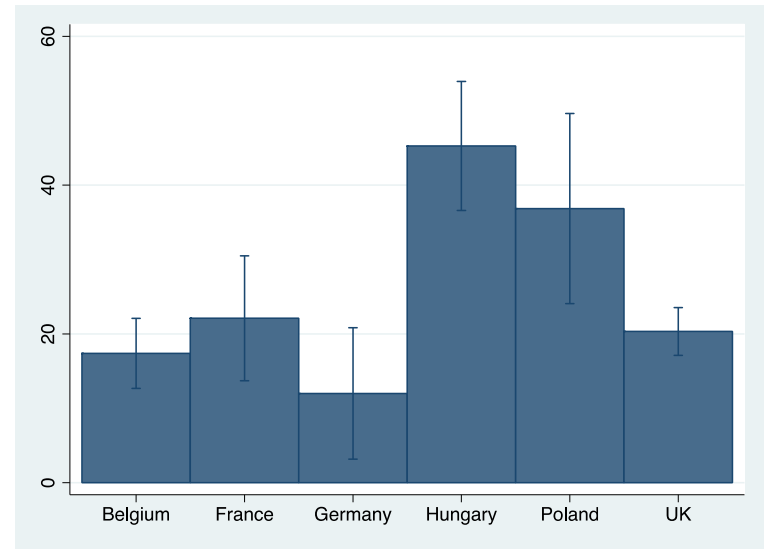
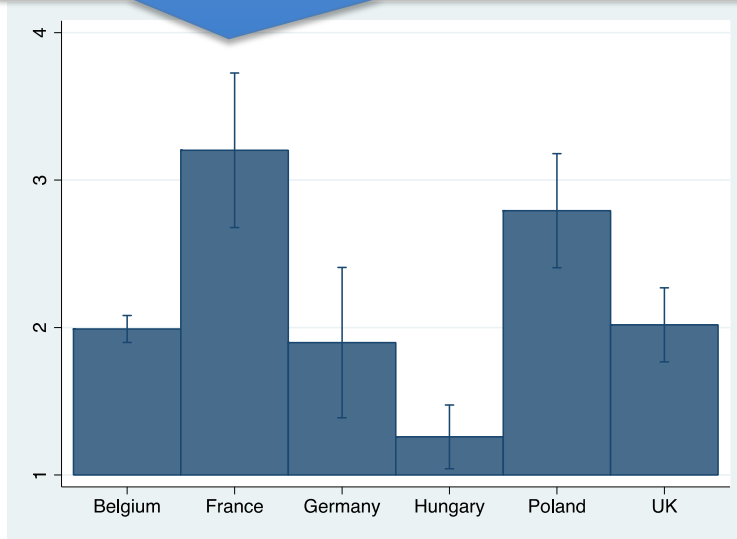
# Germany vs France

Downsizing, Outsourcing, Exit due to climate change policies

1=no impact

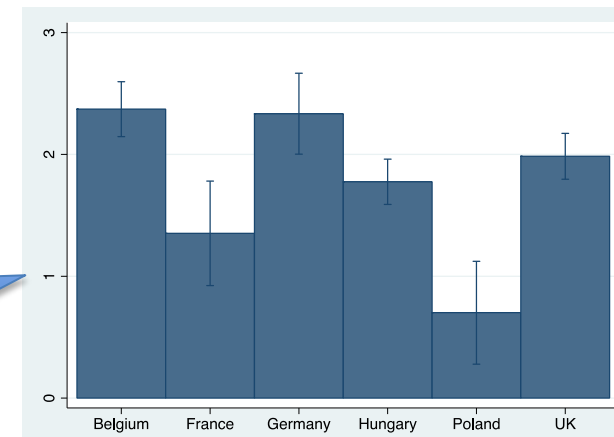
3=about 10% output or employment reduction

5=complete closure very likely



Cost pass trough

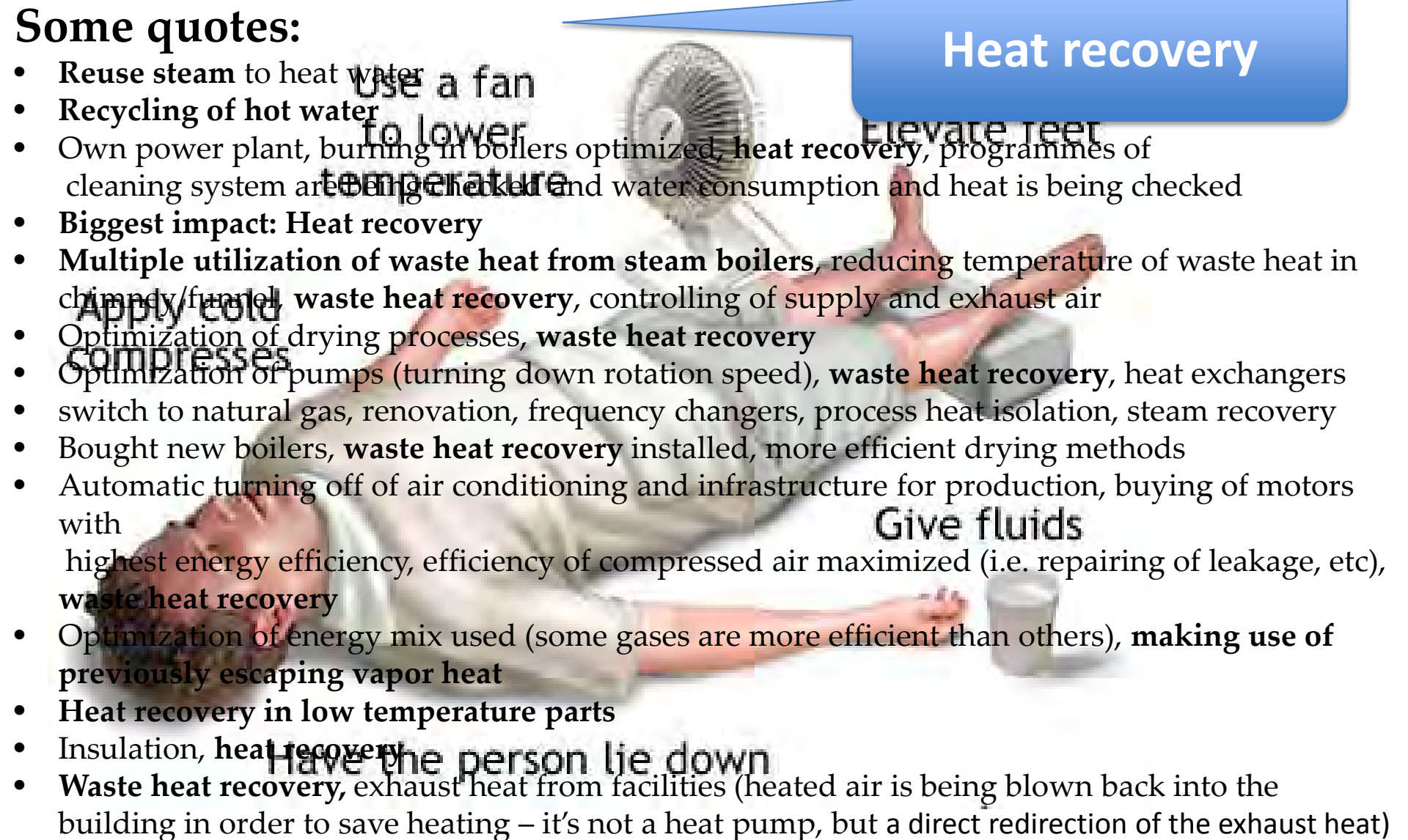
Clean Innovation activities:  
1= none  
5=all R&D is for clean innovation





# What do firms actually do?

## Some quotes:

- 
- Reuse steam to heat water
  - Recycling of hot water
  - Own power plant, burning in boilers optimized, heat recovery, programmes of cleaning system are being checked and water consumption and heat is being checked
  - **Biggest impact: Heat recovery**
  - **Multiple utilization of waste heat from steam boilers**, reducing temperature of waste heat in chimney/funnel, **waste heat recovery**, controlling of supply and exhaust air
  - Optimization of drying processes, **waste heat recovery**
  - Optimization of pumps (turning down rotation speed), **waste heat recovery**, heat exchangers
  - switch to natural gas, renovation, frequency changers, process heat isolation, steam recovery
  - Bought new boilers, **waste heat recovery** installed, more efficient drying methods
  - Automatic turning off of air conditioning and infrastructure for production, buying of motors with highest energy efficiency, efficiency of compressed air maximized (i.e. repairing of leakage, etc), **waste heat recovery**
  - Optimization of energy mix used (some gases are more efficient than others), **making use of previously escaping vapor heat**
  - **Heat recovery in low temperature parts**
  - Insulation, **heat recovery**
  - **Waste heat recovery**, exhaust heat from facilities (heated air is being blown back into the building in order to save heating – it's not a heat pump, but a direct redirection of the exhaust heat)

Heat recovery

Use a fan  
to lower  
temperature

Elevate feet

Apply cold  
compresses

Give fluids

Have the person lie down





# Conclusion

- Evidence that ETS reduced emissions (10 to 20% on average)
- Most gains come from increased carbon efficiency
- No evidence of within firm leakage
- Could be indication that there is no between firm/international leakage
- However: some evidence of negative employment effects



# The road ahead

## More outcomes

- Output, intermediates, profits, prices, productivity, entry, exit, restructuring, etc.)
- Type of employment

➔ Will help to clarify mechanisms

Heterogeneity?

More countries: UK, Belgium





# Thanks

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# Extra slides.....



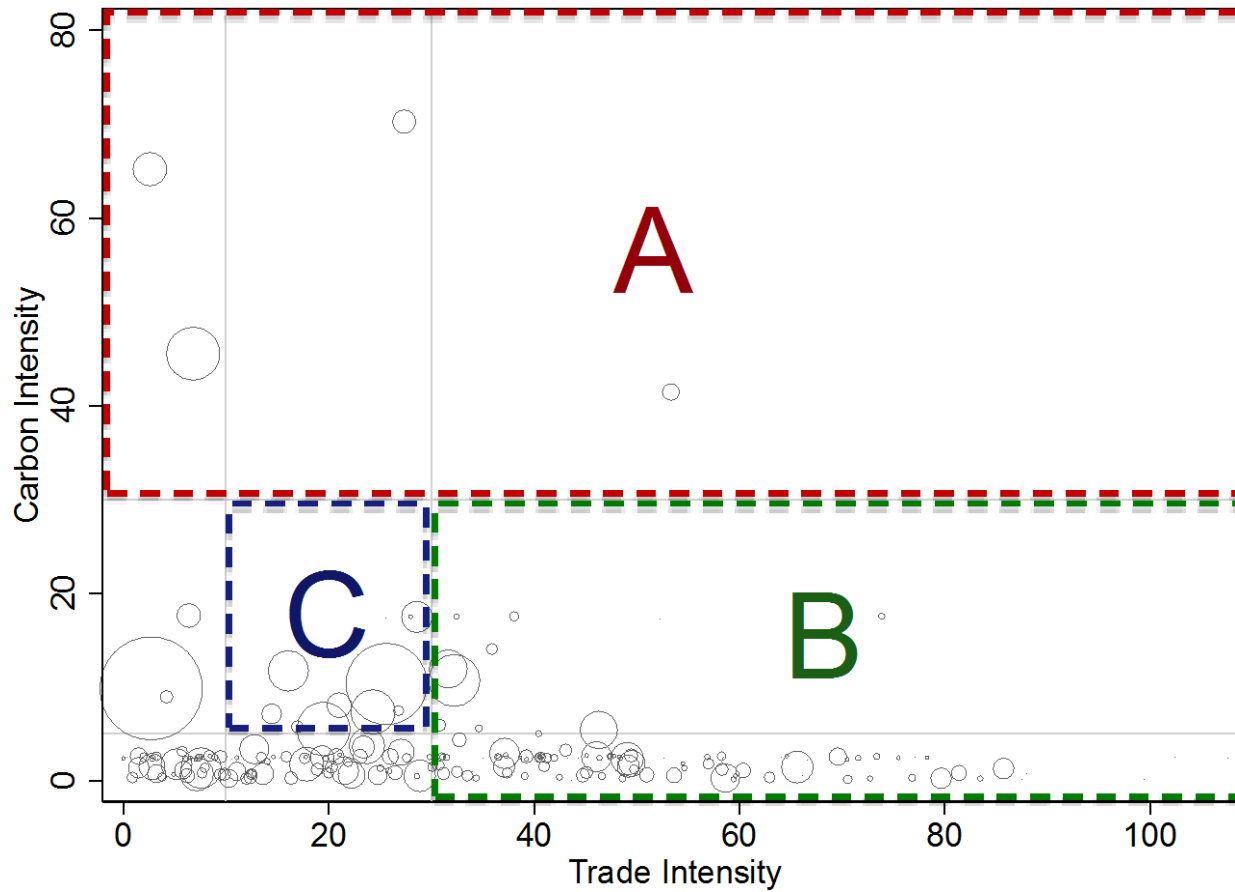


# How to Mitigate negative employment effects?

- Main instrument: Free emission permit allocation
- Free emission permit allocation to ETS firms deemed “at risk”
- At risk criteria at hoc: sector exceeds certain thresholds in terms of carbon and/or trade intensity



# At risk criteria



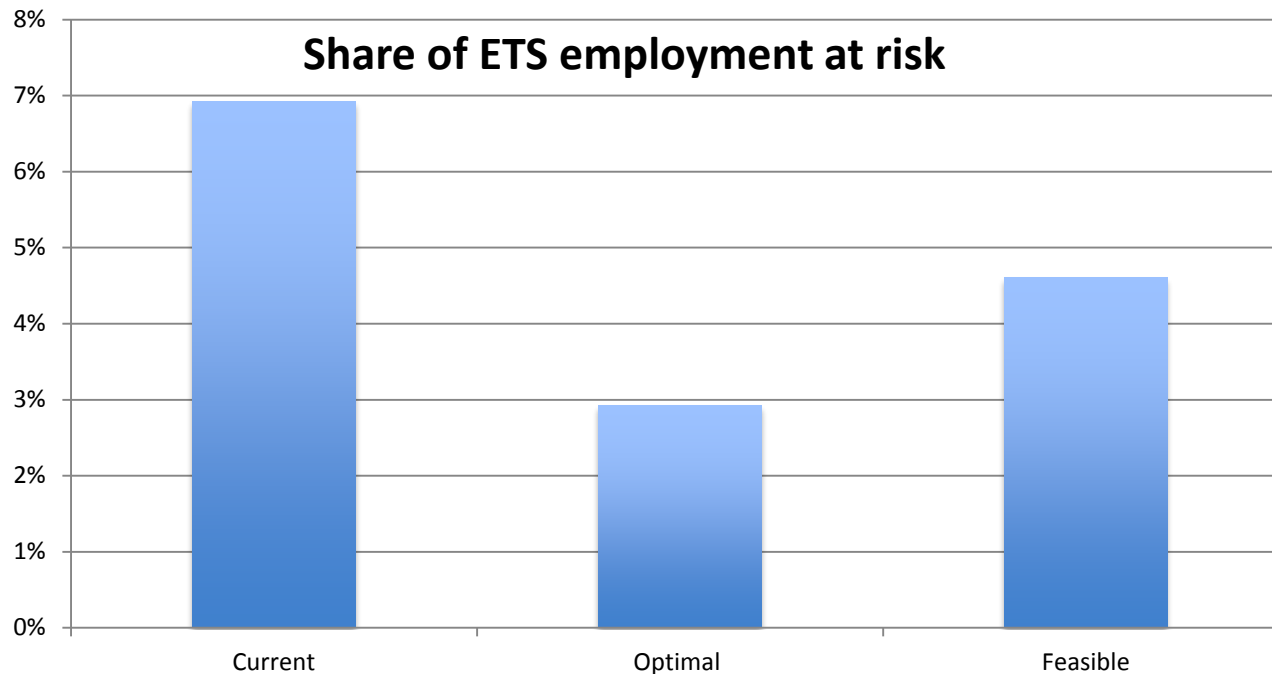


# Interviews with 800 managers

- Martin, Muuls, de Preux & Wagner (2014)
- Open dialogue but scoring in the background (following the method developed by Bloom and van Reenen as well as Propper)
- We derive a firm specific measure of Employment risk due to carbon pricing
- We also derive a measure of marginal impact of free permits



# Optimizing permit allocation



- Equalize marginal impacts on government objective (e.g. job risk) across firms