



THE JOINT IMPACT OF THE EUROPEAN UNION EMISSIONS TRADING SYSTEM ON CARBON EMISSIONS AND ECONOMIC PERFORMANCE

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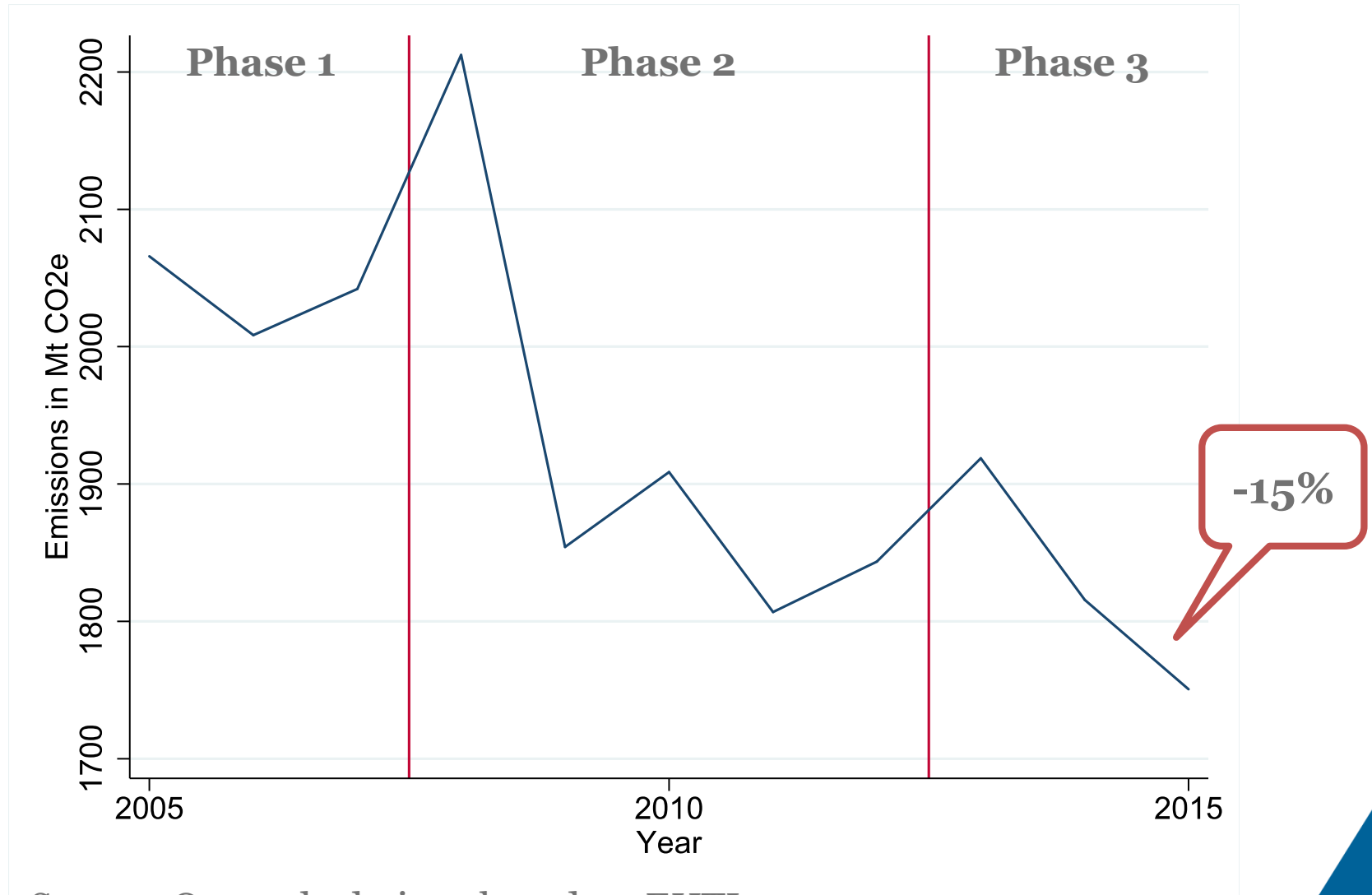


EU ETS: background

- Running since 2005 across 31 countries
- 12,000 covered installations (~8,000 firms), 40% of European GHG emissions
- The largest carbon market in the world
 - Other markets in US, Canada, NZ, Korea, China
 - Plans in Japan, Chile, Mexico



Carbon emissions by EU ETS installations



Source: Own calculations based on EUTL



Questions

- Did the EU ETS cause the emissions decline?
- If so, did it affect the performance of regulated firms?
- Empirically analyse the *causal* impact of the EU ETS on carbon emissions & firm performance
 - Using firm and installation-level data
 - Across Europe



What should we expect?

- Emissions should decrease, if economics works
 - Uncertainty over the magnitude. Oil prices 25% higher 2005-2015 compared to 2005; recession
- Firm performance:
 - Basic economic theory predicts negative impact, but alternative hypotheses (e.g. Porter)
 - Empirical evidence: small but negative impacts of environmental regulation (Greenstone, 2002; Kahn and Mansur, 2010; Walker, 2011, 2013)



Evaluating the impact of EU ETS

- Not all carbon-emitting plants are regulated
 - Inclusion criteria at installation level related to **production capacity**
 - Combustion: thermal input > 20 MWh
 - Steel: production capacity > 2.5 tonnes per hour
 - Glass and glass fibre: melting capacity > 20 tonnes/day
- Establishing the policy's causal effect
 - A **natural experiment**: possible to use matching methods



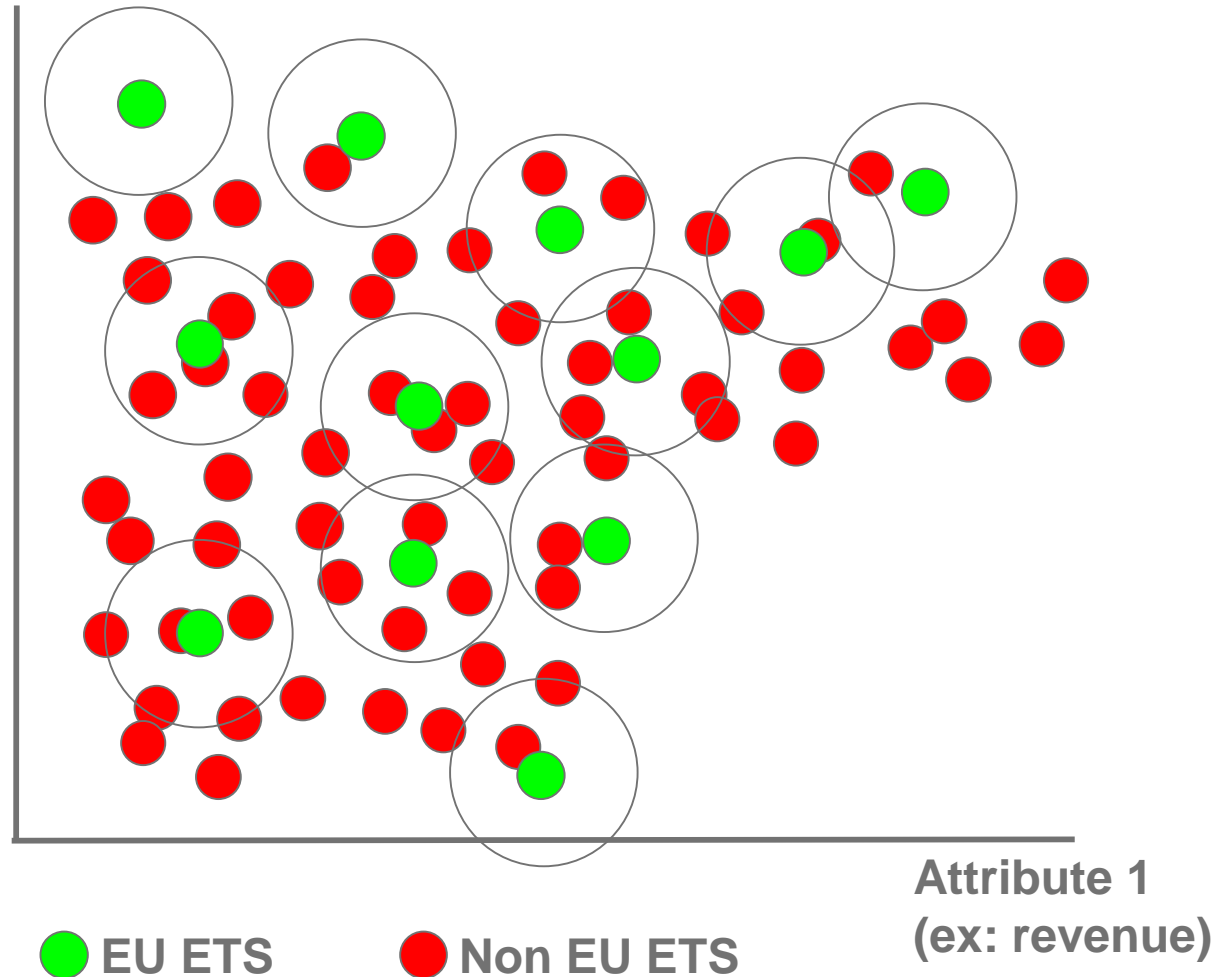
A matching method

- Identify regulated installations & companies
- Construct a control group of similar but unregulated entities and compare with regulated entities
- Control group:
 - Same country, same sector, similar pre-2005 characteristics (carbon emissions, financials) but below threshold
- Note: theoretically less clean at installation level but production capacity unobserved



Matching for dummies

Attribute 2
(ex: assets)

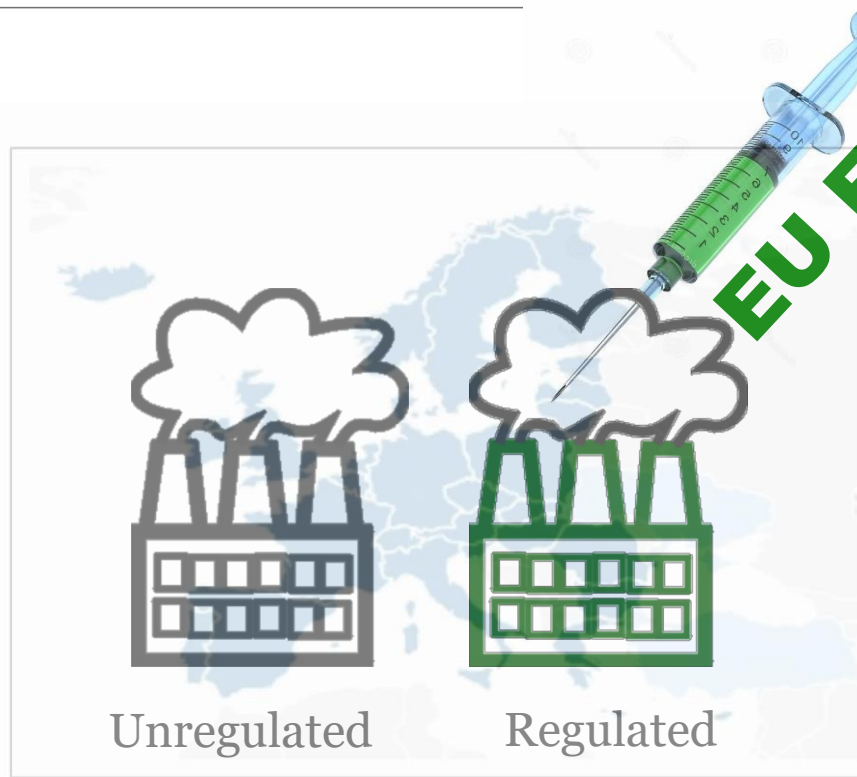




What we are comparing

Hammer GmbH

- NACE 1712 (Manufacture of paper and paperboard)
- 150 employees
- Turnover 26.9M
- Fixed assets 7.9M



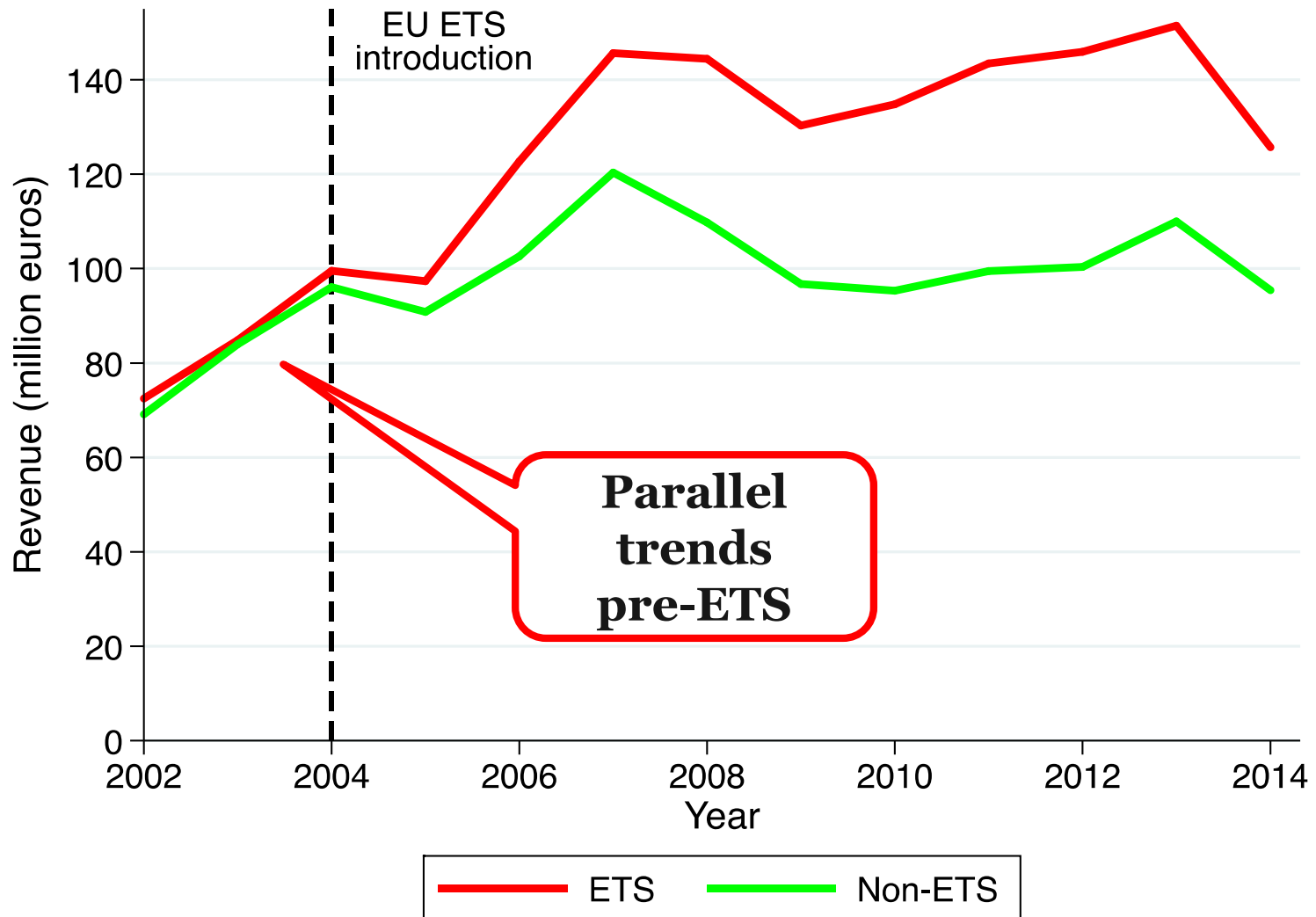
Papierfabrik Hainsberg GmbH

- NACE 1712 (Manufacture of paper and paperboard)
- 152 employees
- Turnover 25.9M
- Fixed assets 9.7M

EU ETS impact?

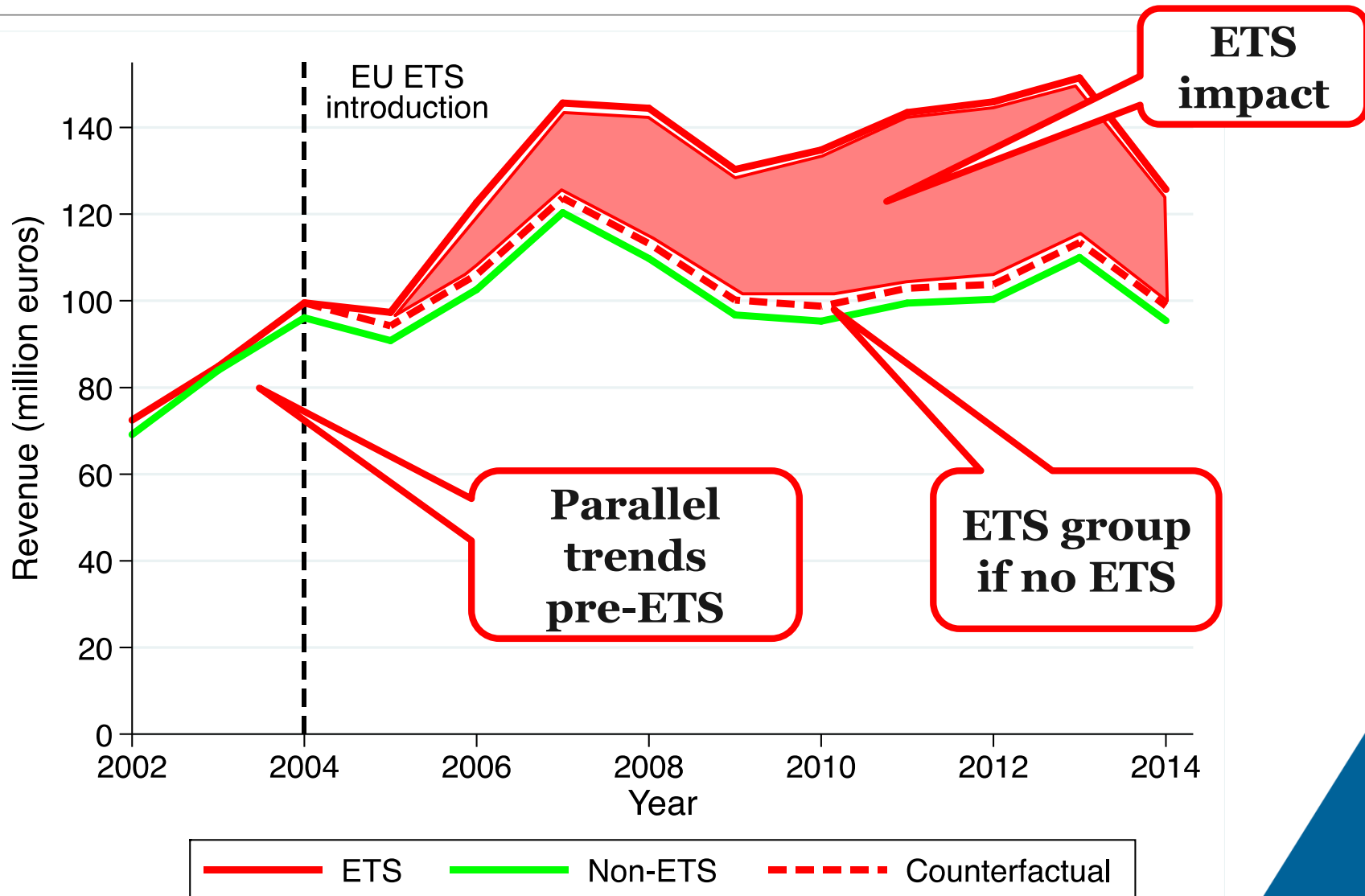


ETS effect: ex. firms' revenue





ETS effect : ex. firms' revenue





Complications

- **Direct spillovers:** If firm A is regulated and suffers from carbon price, this should benefit its competitors
 - Competitors operating in the same market also provide the best comparators
- **Indirect treatment** through higher electricity prices (general equilibrium effects)
- We can only capture the **net effect** of the EU ETS (ie, competitiveness effect)



IMPACT ON CARBON EMISSIONS



Emissions Data

- National Pollution Release and Transfer Registries (PRTR)
 - At installation level (pre and post ETS)
 - Small enough reporting threshold in France, Netherlands, Norway, UK

| Country | France | Netherlands | Norway | UK |
|-------------------------|--------|-------------|--------|-------|
| Coverage since | 2003 | 1990 | 1997 | 1998 |
| Reporting threshold CO2 | 10 kt | <1 kt | <1 kt | 10 kt |
| # installations | 14797 | 1849 | 1447 | 5500 |
| - with CO2 emissions | 1671 | 1596 | 499 | 1024 |
| - covered by EU ETS | 912 | 294 | 113 | 509 |

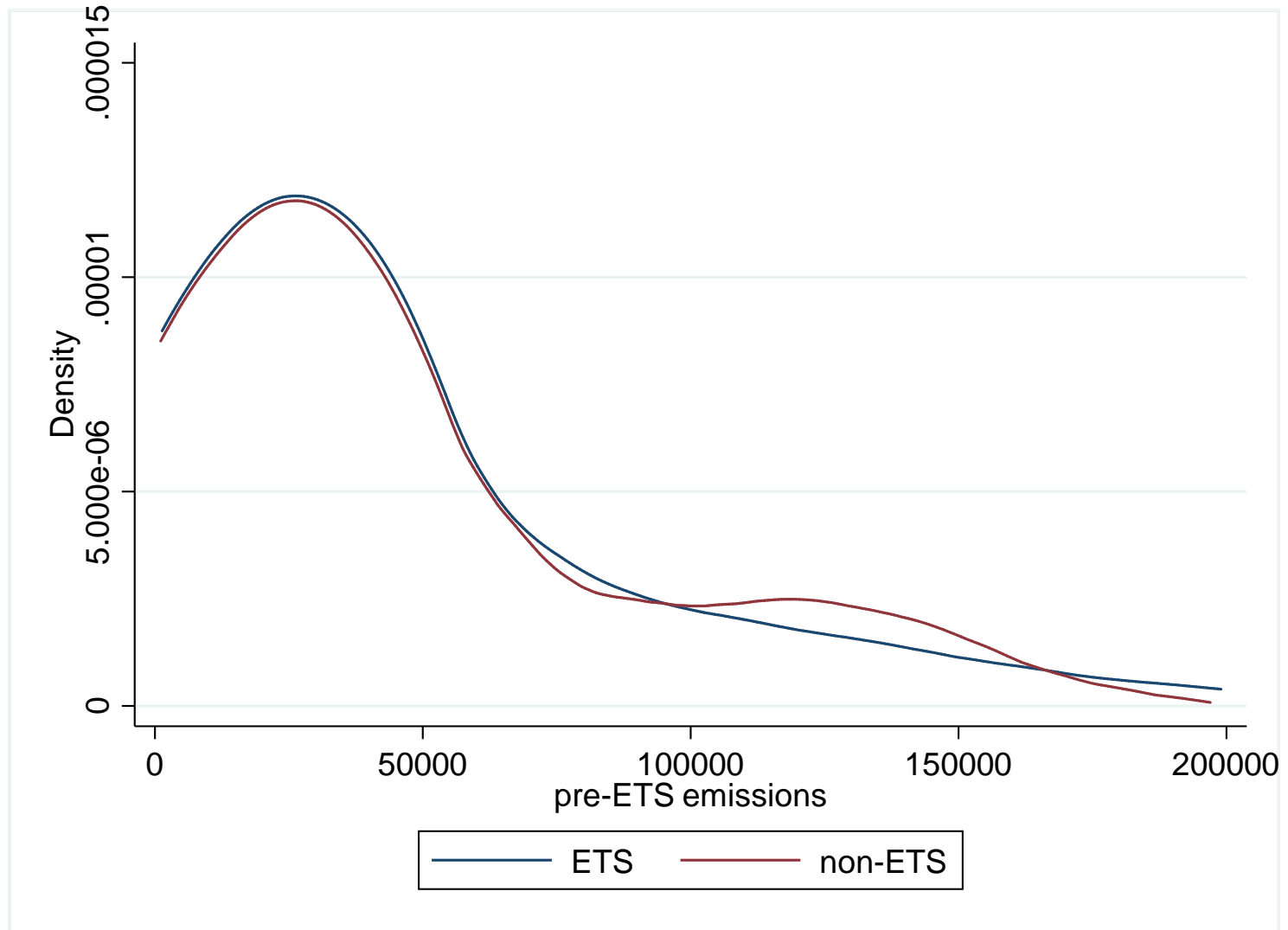


Matching

- Nearest neighbour matching on
 - Country
 - Economic sector
 - Pre-ETS emissions
 - Pre-ETS emissions growth rate
- Focus on manufacturing



After matching: Emissions distribution





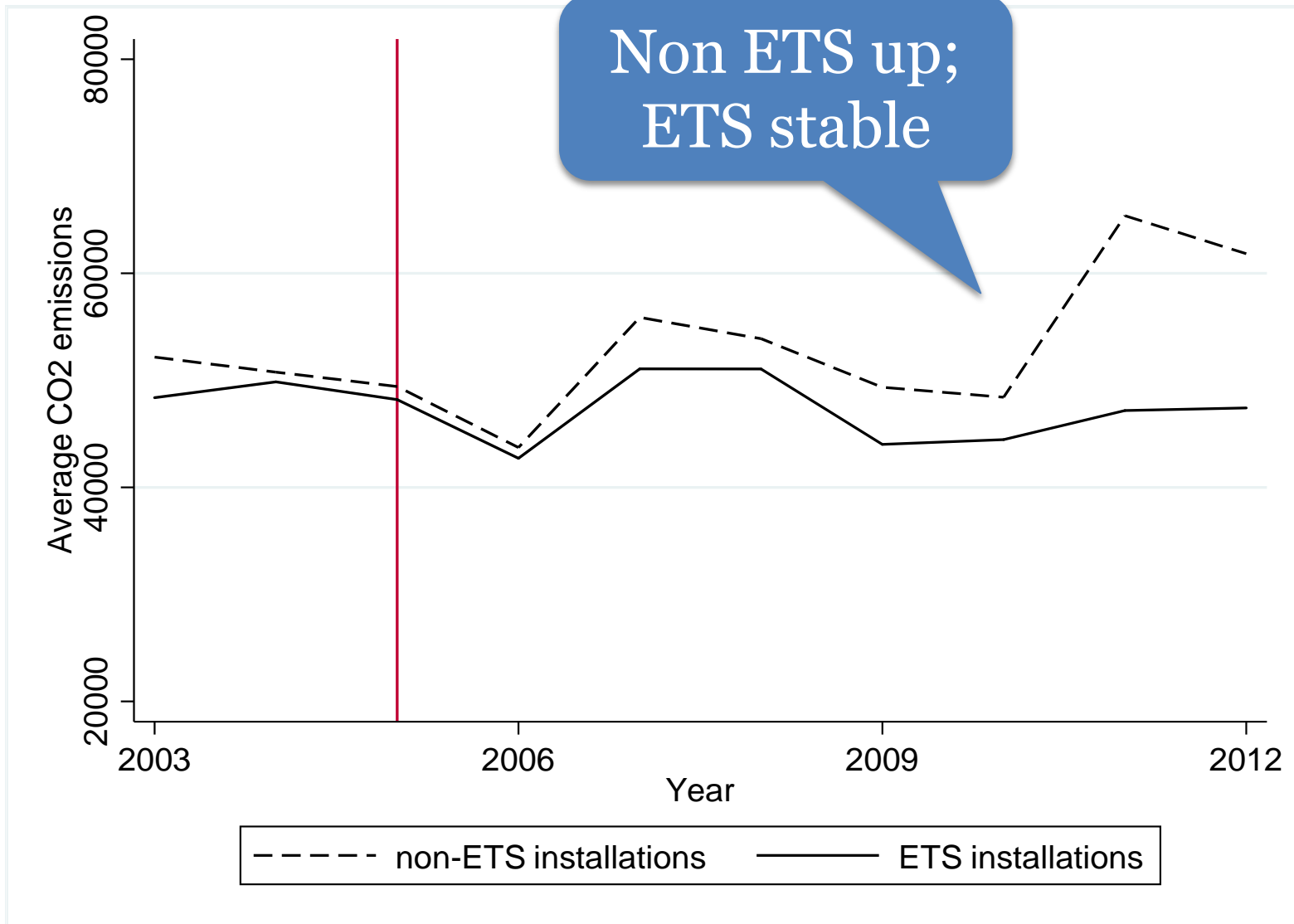
Limited sample

- Small sample: 400 installations
 - But unbiased
- Explore sensitivity

| | # installations | | # observations | |
|----------------|-----------------|---------|----------------|---------|
| Country | ETS | non-ETS | ETS | non-ETS |
| France | 169 | 96 | 1352 | 768 |
| Netherlands | 38 | 45 | 190 | 181 |
| Norway | 7 | 5 | 84 | 55 |
| United Kingdom | 26 | 22 | 305 | 219 |
| Total | 240 | 168 | 1931 | 1223 |

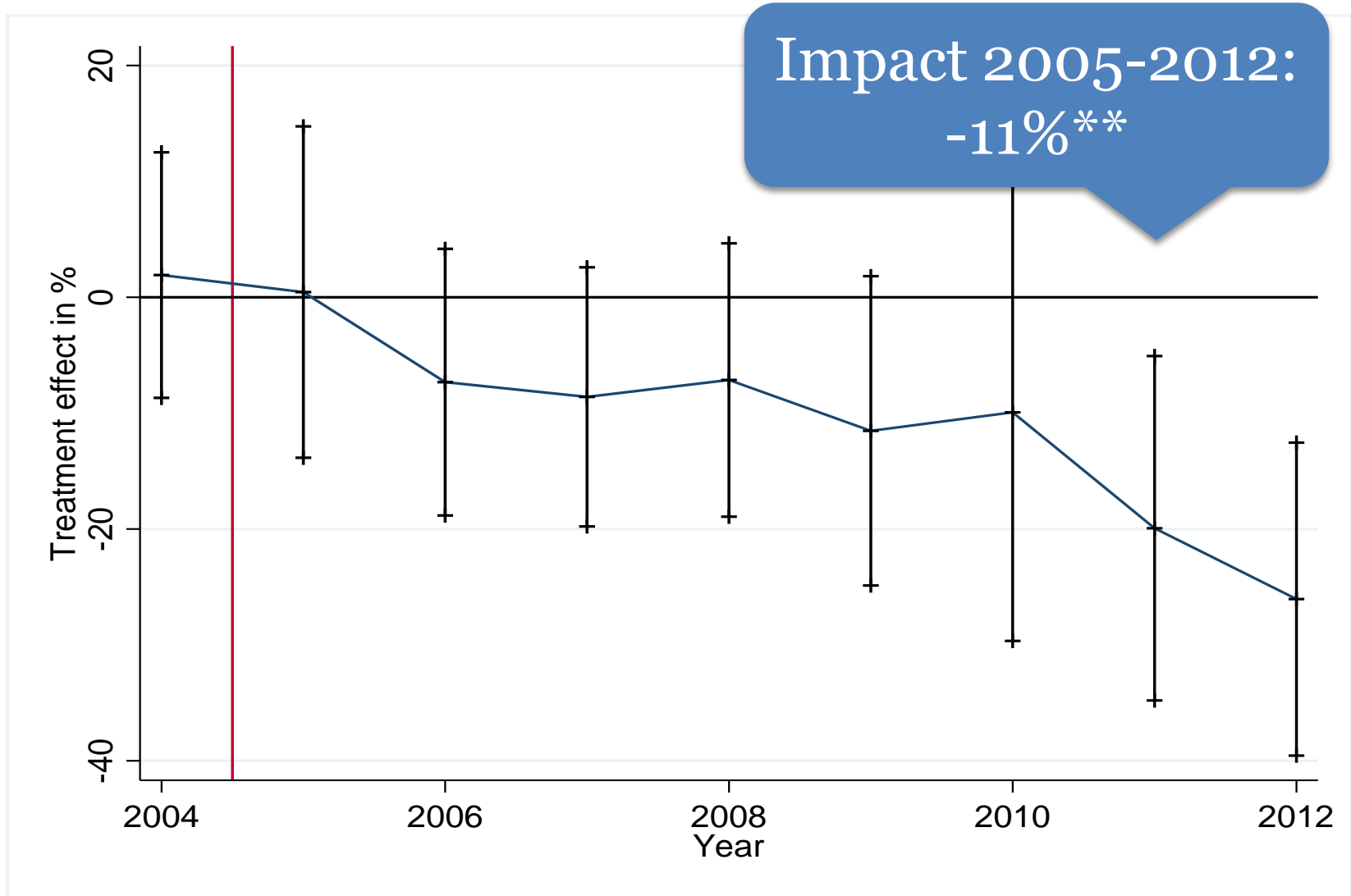


Emissions after matching





ETS impact on emissions by year



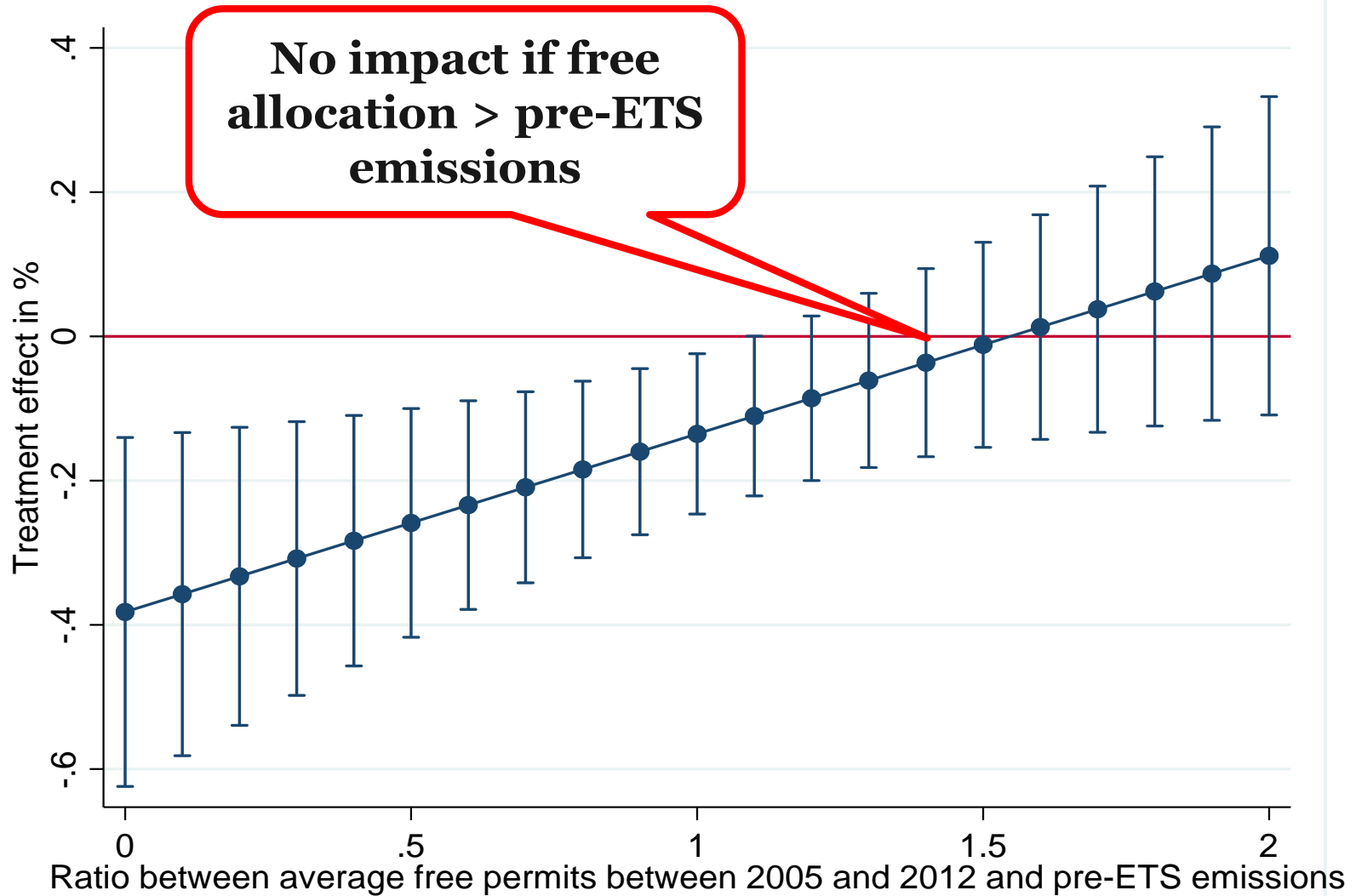


Robustness

| Robustness check | Point estimate | # Inst. | # Obs. |
|--|----------------|---------|--------|
| Remove 1% largest installations | -0.08** | 403 | 3124 |
| | (0.04) | | |
| Remove most influential installations | -0.06* | 393 | 3040 |
| | (0.03) | | |
| Not subtract emissions from biofuels | -0.11* | 407 | 3153 |
| | (0.06) | | |
| Remove unbalanced installations | -0.11 | 185 | 1818 |
| | (0.07) | | |
| Add verified emissions from EUTL | -0.16** | 407 | 3490 |
| | (0.07) | | |
| only if matched control is non-missing | -0.12* | 407 | 3262 |
| | (0.06) | | |
| Add zero emissions for exiting installations | -0.12** | 407 | 3288 |
| | (0.06) | | |
| Match on NACE 2-digit code | -0.07* | 673 | 5393 |
| | (0.04) | | |



Impact of free allowances on ETS effect





IMPACT ON FIRM PERFORMANCE



Firm performance data

- Orbis global financial database
 - At firm level (pre and post ETS)
 - **All EU ETS countries**
- EU ETS companies: own at least one EU ETS installation
 - Match with installations using EU ETS-Orbis link from EUI FSR Climate

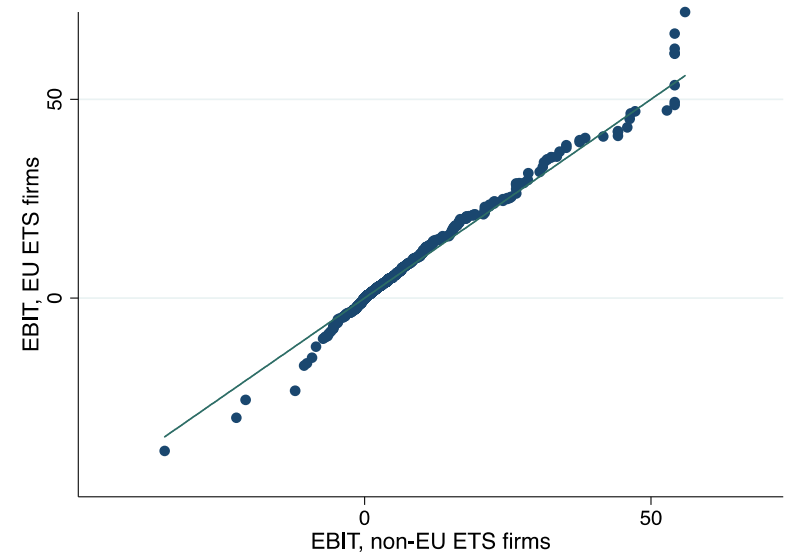
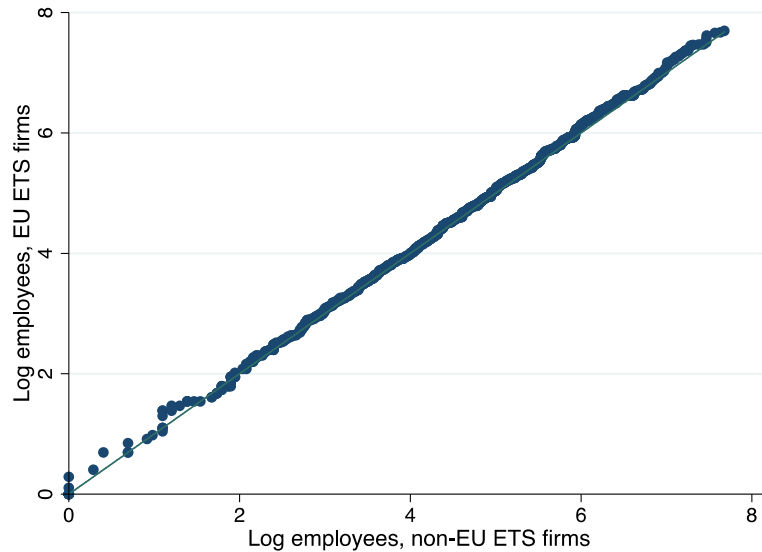
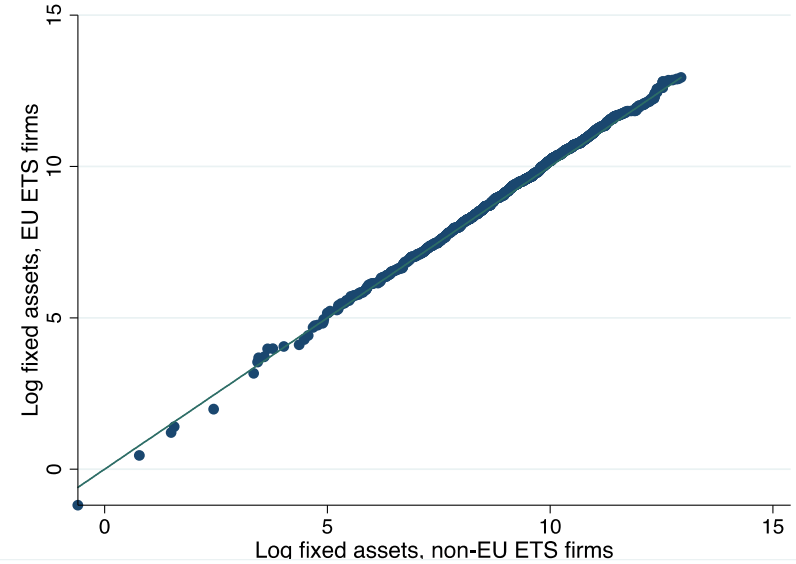
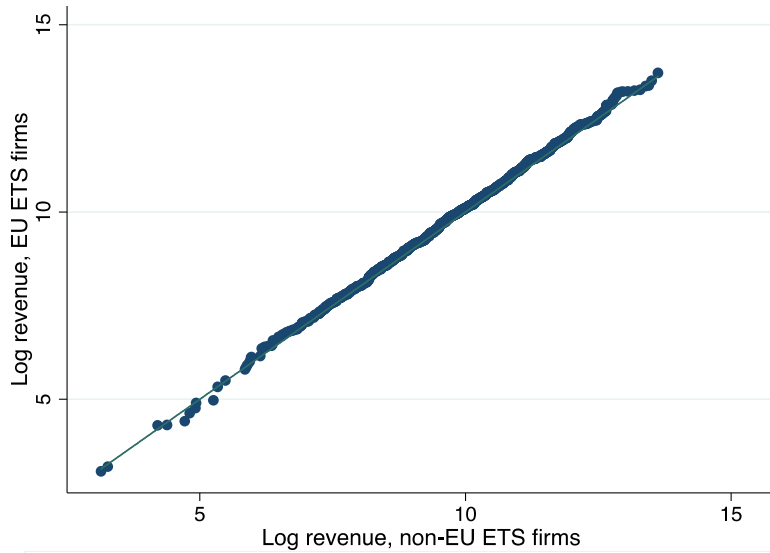


Matching

- Matching on:
 - Country
 - Sector
 - Turnover, fixed assets, employment and profit before 2005
- Good comparators for 2,217 EU ETS firms
 - Pre-2005 data not always available
 - No comparators for very large firms (ex.: EDF)

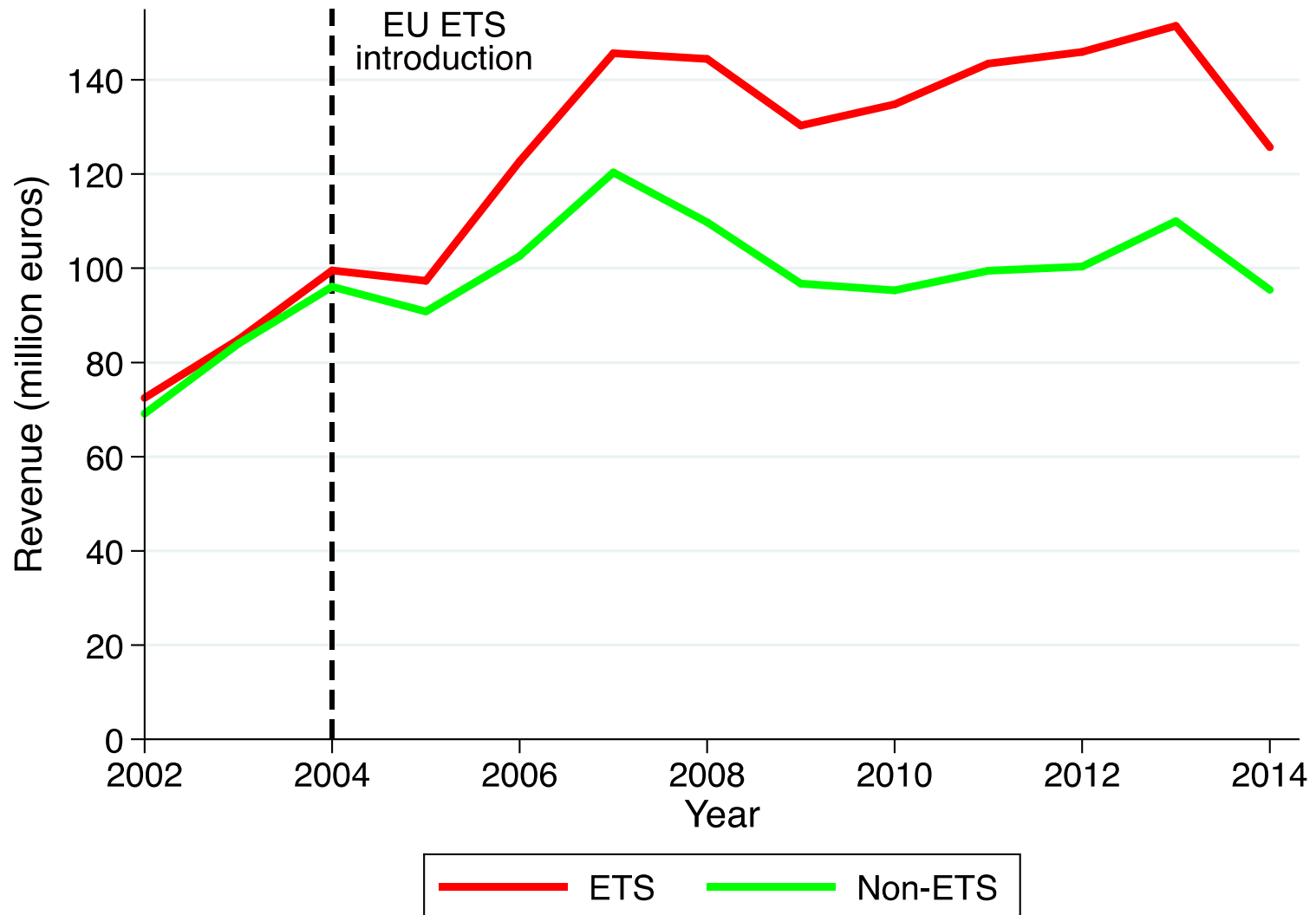


A good control group



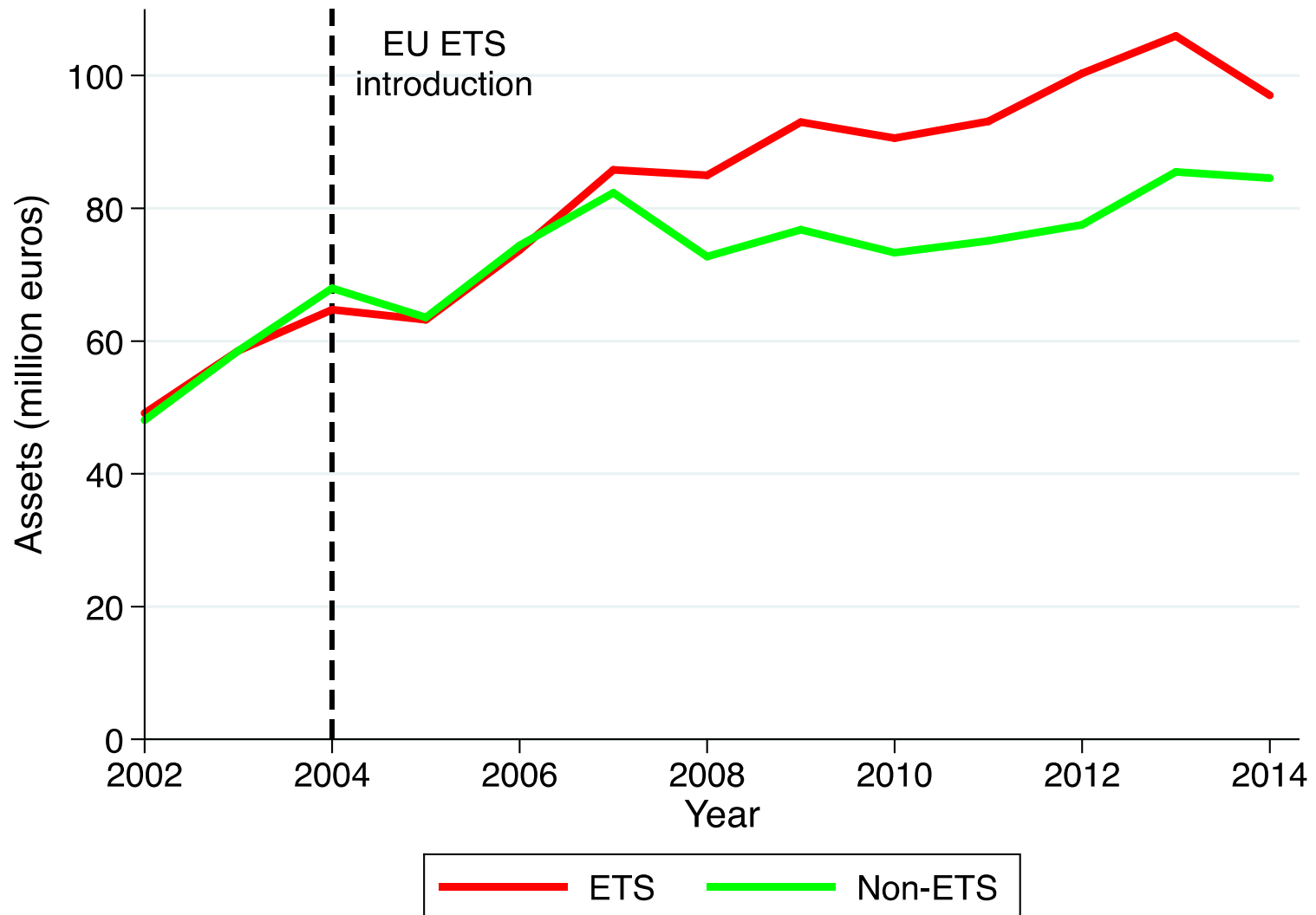


Revenue



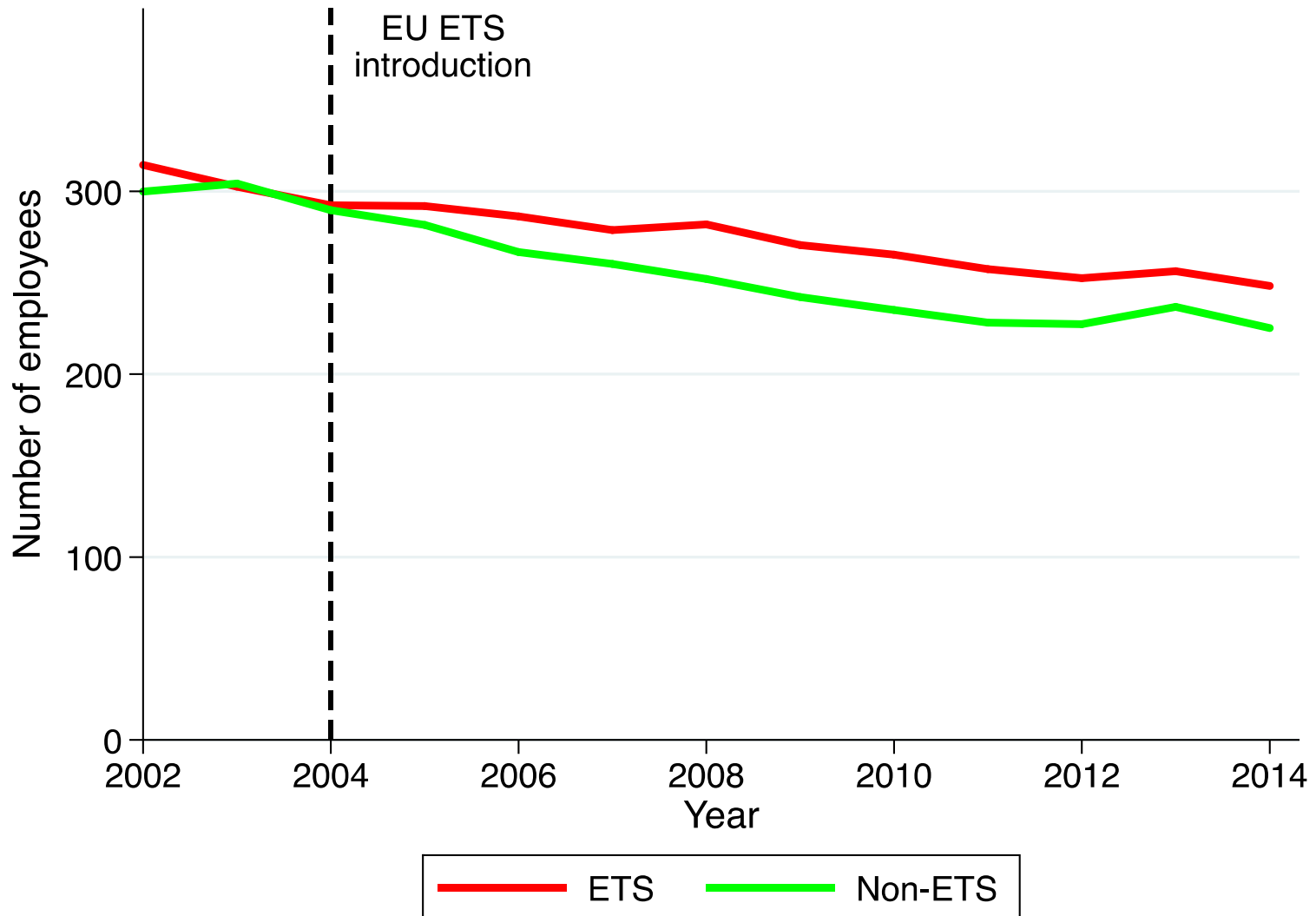


Fixed assets



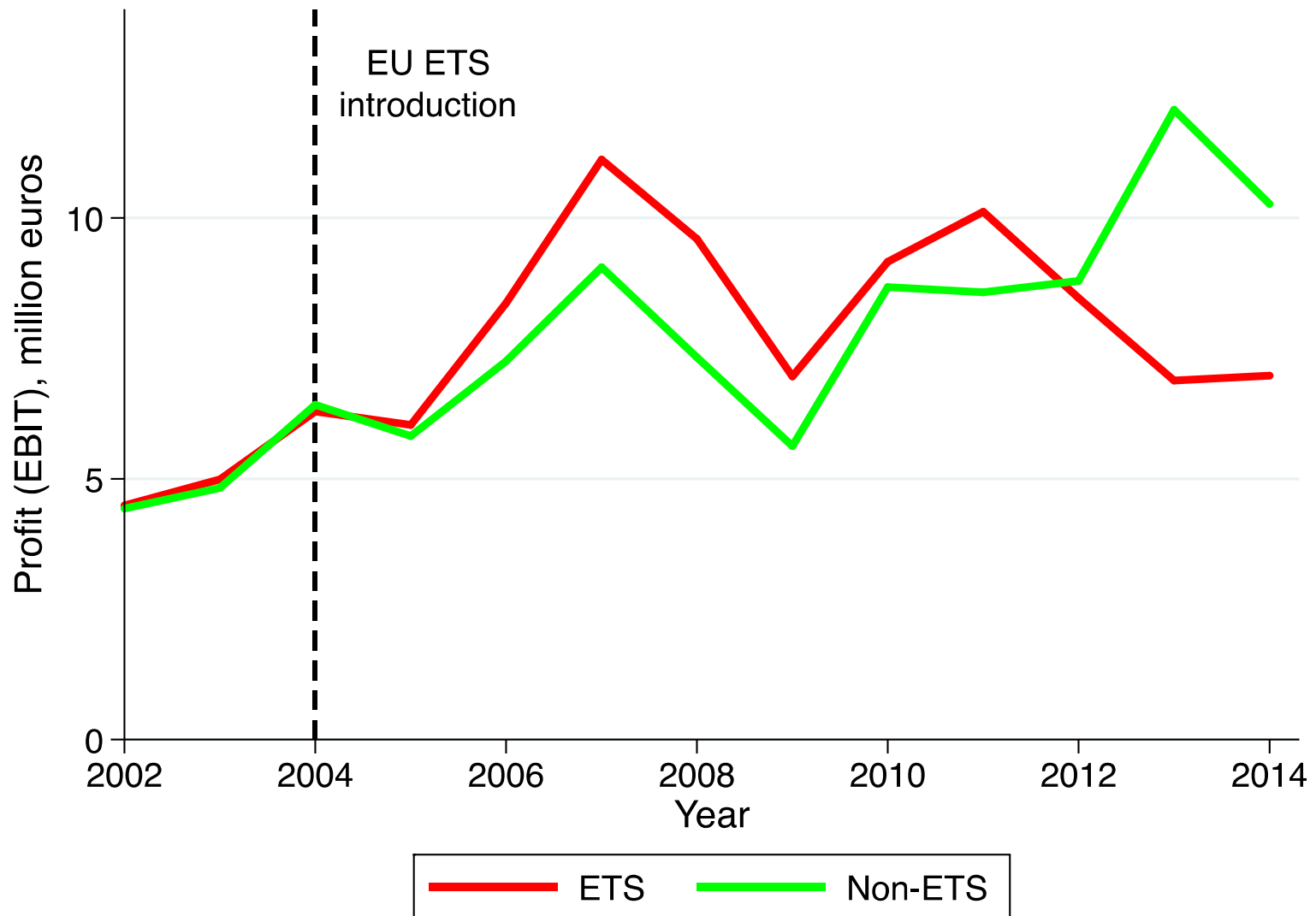


Employees





Profit





Summary of results

| Outcome variable | Effect |
|------------------|--------------------------|
| Employment | +2% (not significant) |
| Profits | +280k€ (not significant) |
| Revenue | +8-16%*** |
| Fixed assets | +6-8%*** |



Summary of results

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- Cael & Dechezleprêtre 2017: EU ETS caused +30% filings of low-carbon patents



Robustness

- Control for country- and sector-specific trends
- Keeping only firms observed throughout the whole sample period
- Replace values with missing within pairs
- Matching at NACE 2-digit or 4-digit level



Explanations

- Free allocations?
 - Effects stronger for firms in sectors deemed at risk of relocation
 - But effect in many sectors (not only electricity): esp. Non-Metallic Minerals and Basic Metals
 - Assume 100% cost pass-through with free allowances: can only explain 20% of the effect on revenue
- Productivity improvements?
 - Stronger effect on revenue and employment for firms that reduced emissions the most



Comparison with other micro studies

- Commins et al 2011: EU ETS +1.5% employment, -3% TFP growth
- Abrell et al 2011: no stat. sign. impact of EU ETS on value added, profit margin or employment.
- Wagner et al 2014 (**France**): no stat. sign. impact on employment
- Petrick & Wagner 2014 (**Germany**): no stat. sign. impact on employment, turnover or exports
- Klemetsen et al 2016 (**Norway**): increases in value added and labor productivity
- Jaraite and Di Maria 2016 (**Lithuania**): no stat. sign. impact on profitability
- Calligaris et al 2018 (**Italy**): positive impact on TFP



Conclusion

- The EU ETS seems to have:
 - Modestly reduced emissions (in line with modest price)
 - Without damaging firms' competitiveness, and even improving their performance
 - Incentivized investment and low carbon innovation (Calel & Dechezleprêtre 2016)
- The big questions
 - What are the mechanisms?
 - What will happen when the carbon price increases?



For more information:

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Back up

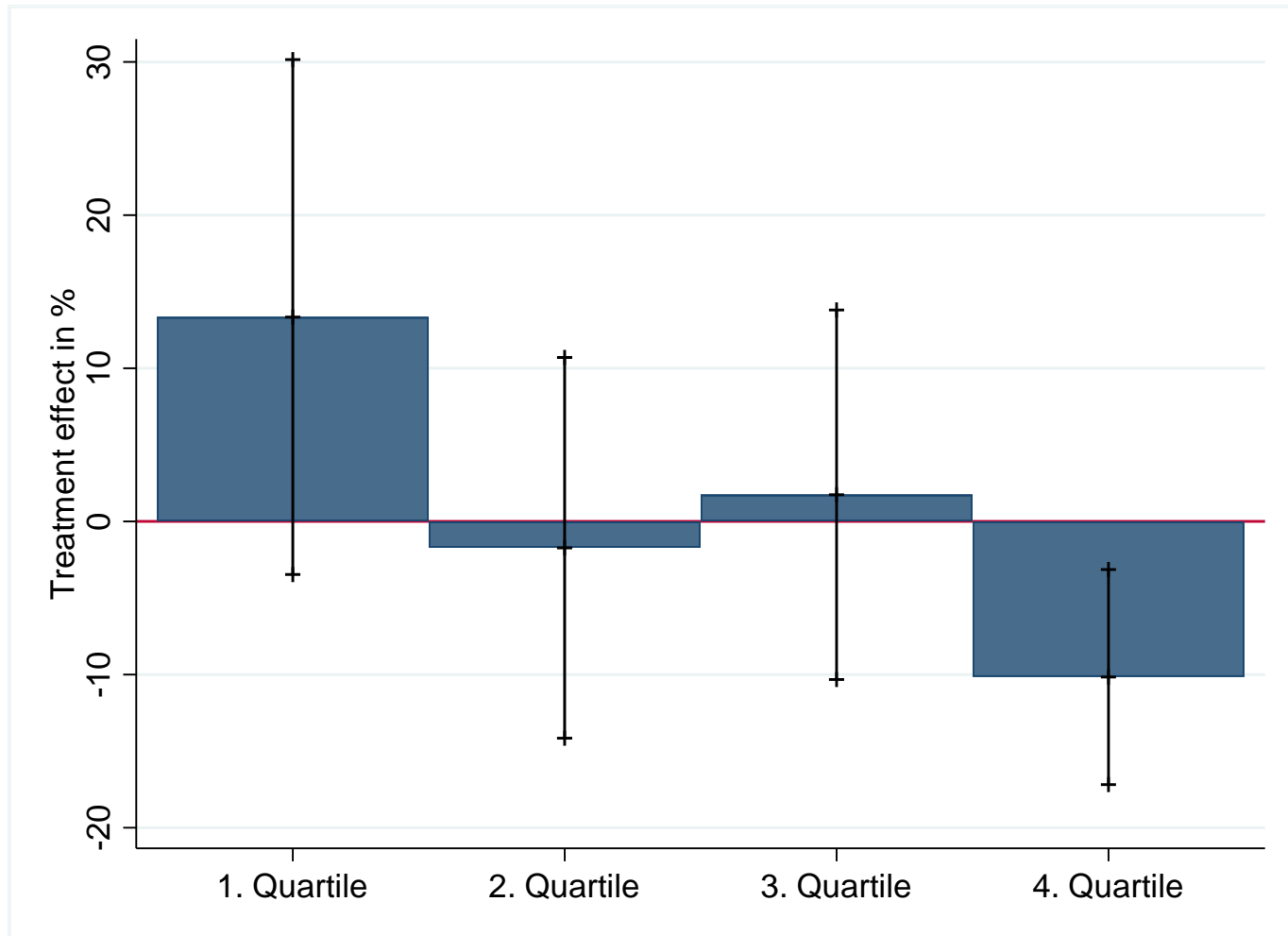


Implied elasticity

- Average price of carbon over the period:
10€/tCO₂
- 10€/tCO₂ increases electricity prices by
2.5-7.5€/MWh (Lise et al 2010)
- Average electricity costs in Europe:
15-20€/MWh
- So EU ETS increased electricity prices by
20-50%
- Implied carbon price elasticity of our results:
0.2/0.5



Results by size (pre-ETS emissions)



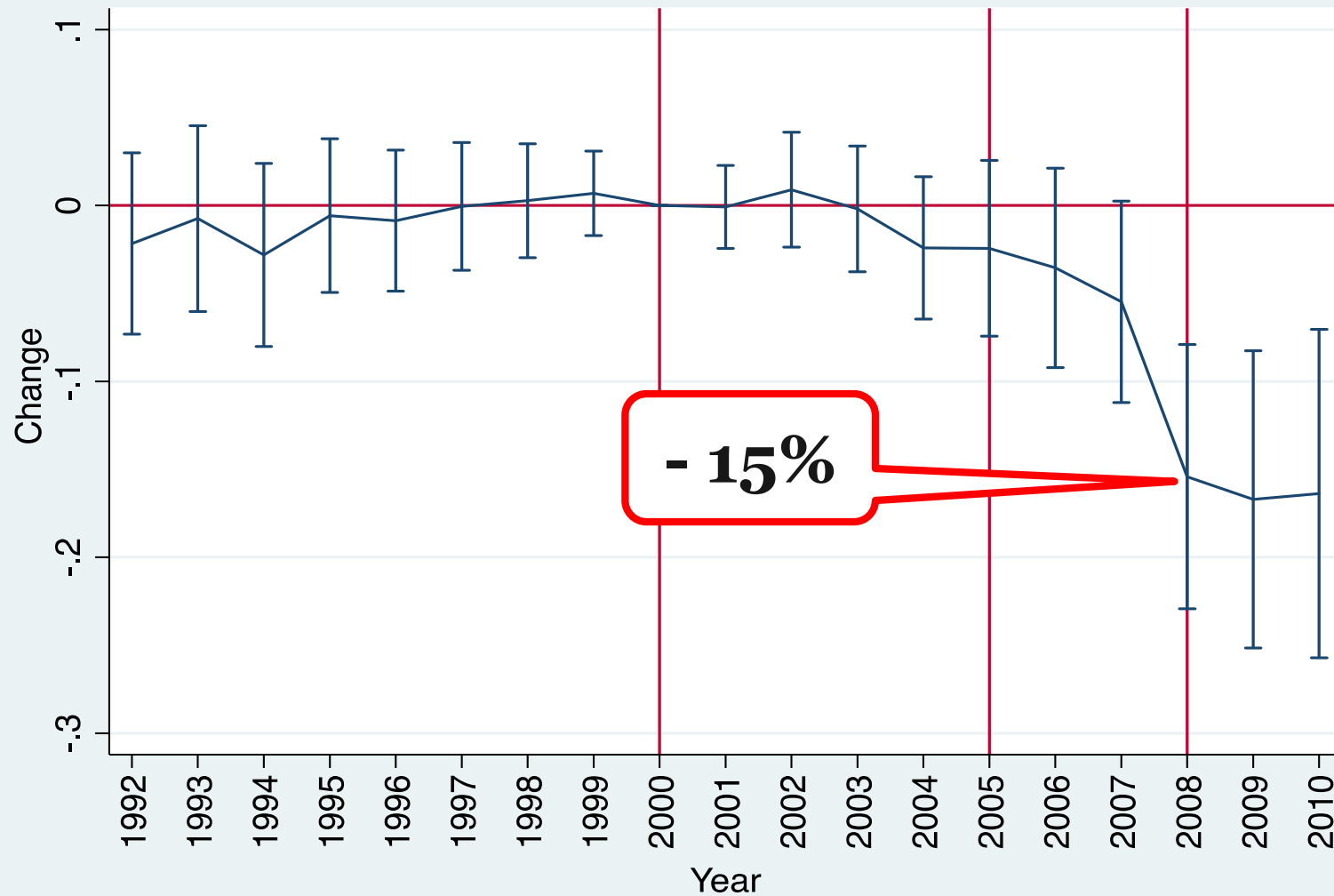


Price of EU ETS allowances 2005-2015



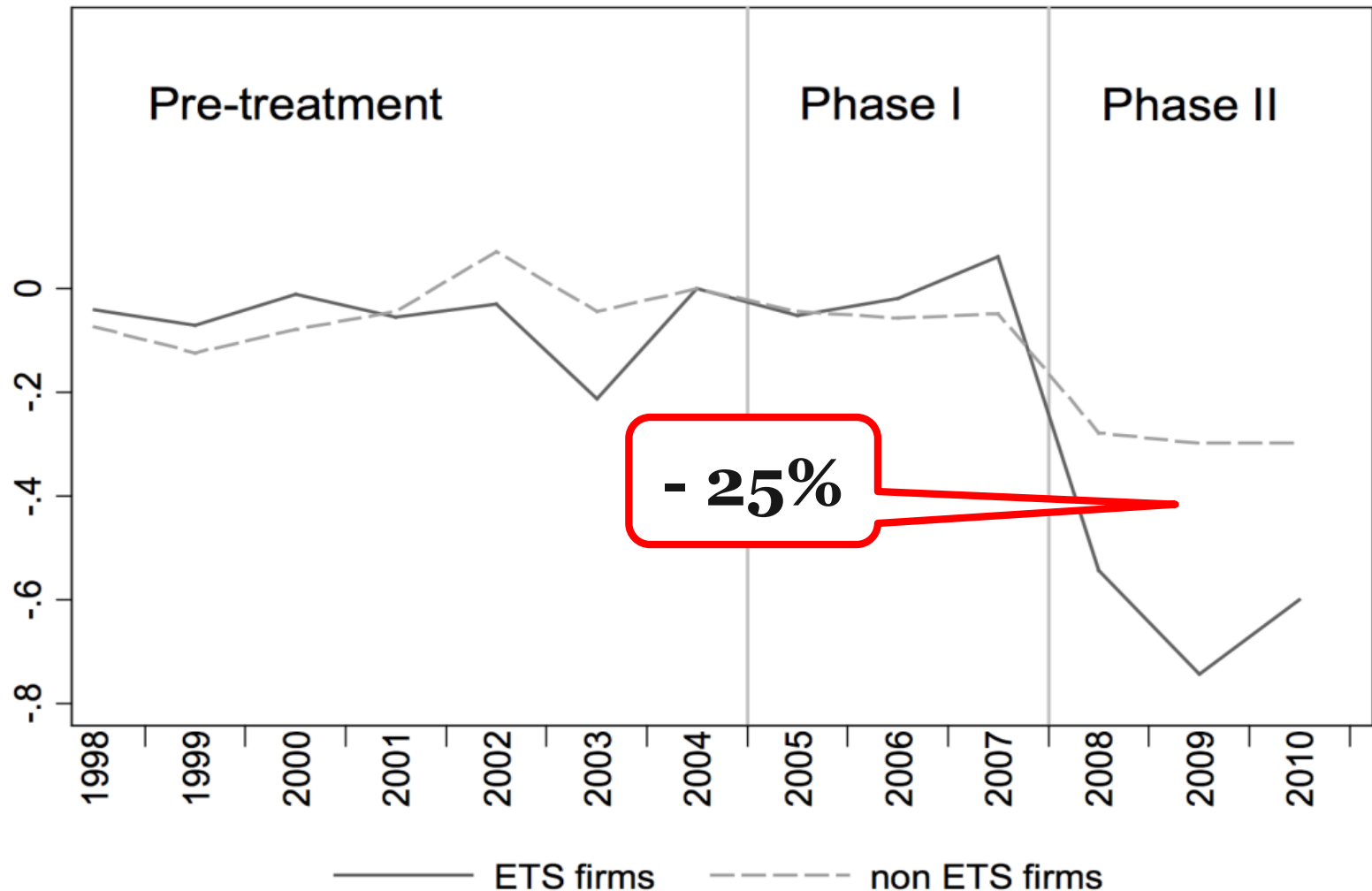


Impact in France (Wagner et al 2014)



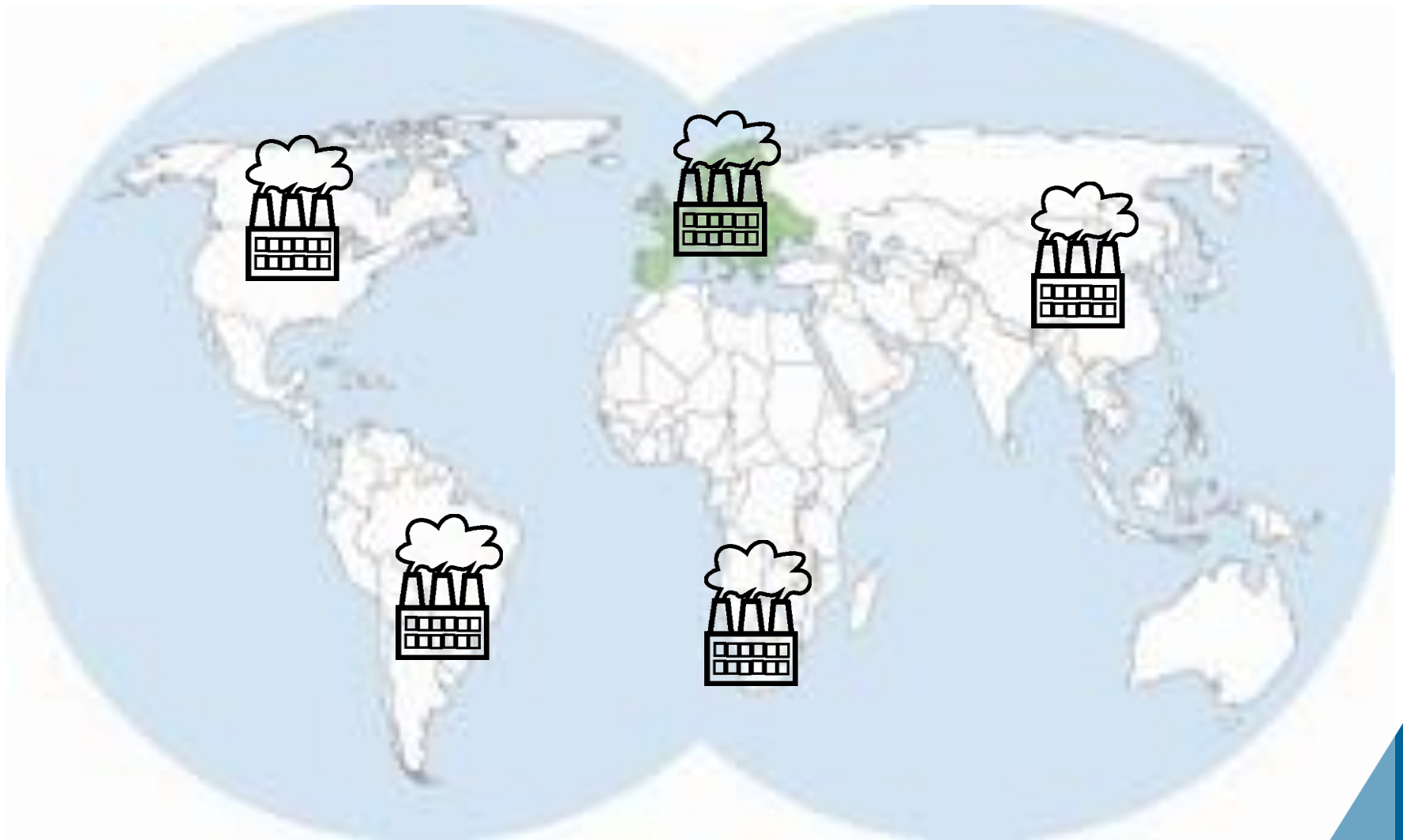


Impact in Germany (Petrick & Wagner 2014)



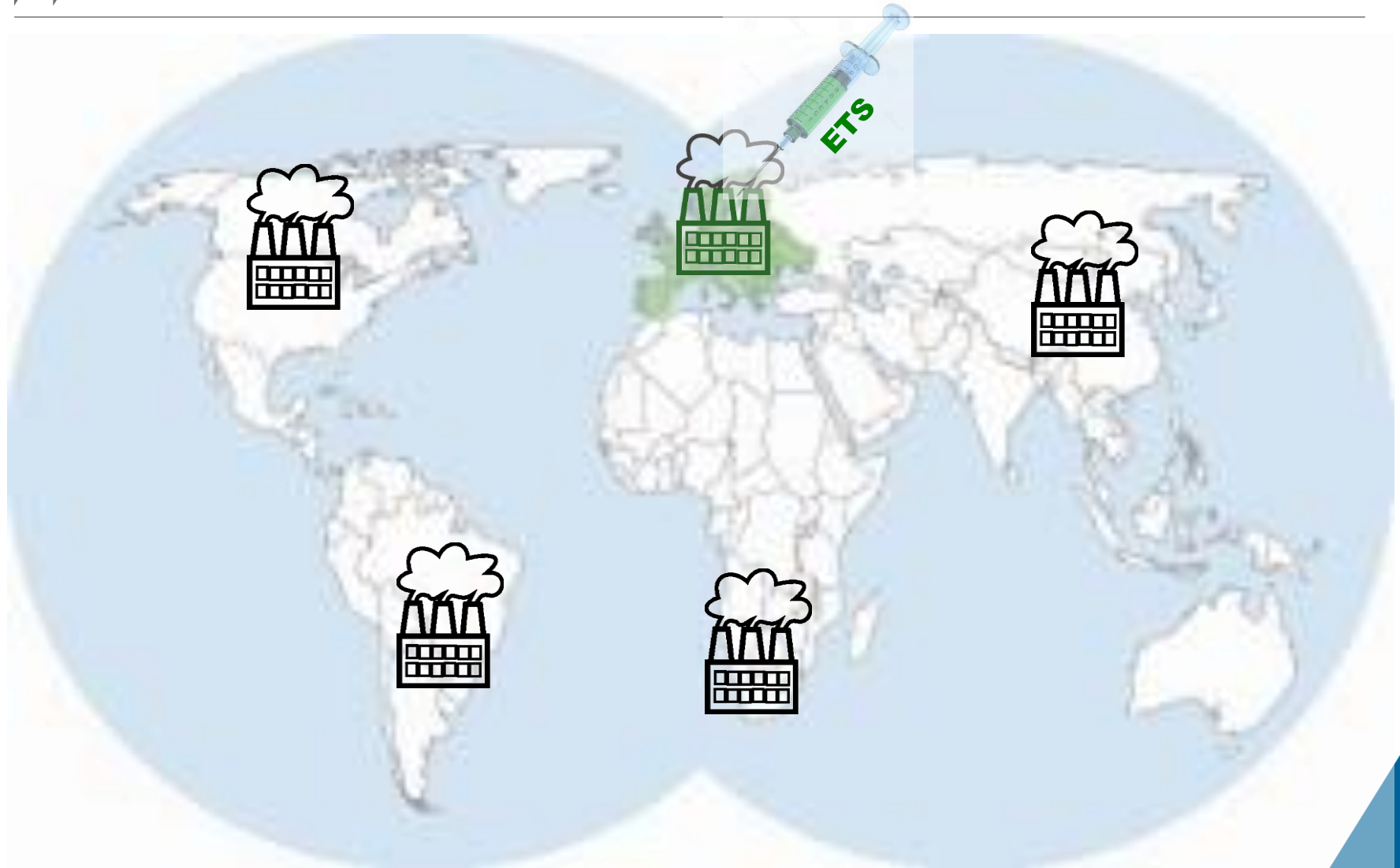


Is it simply leaking?



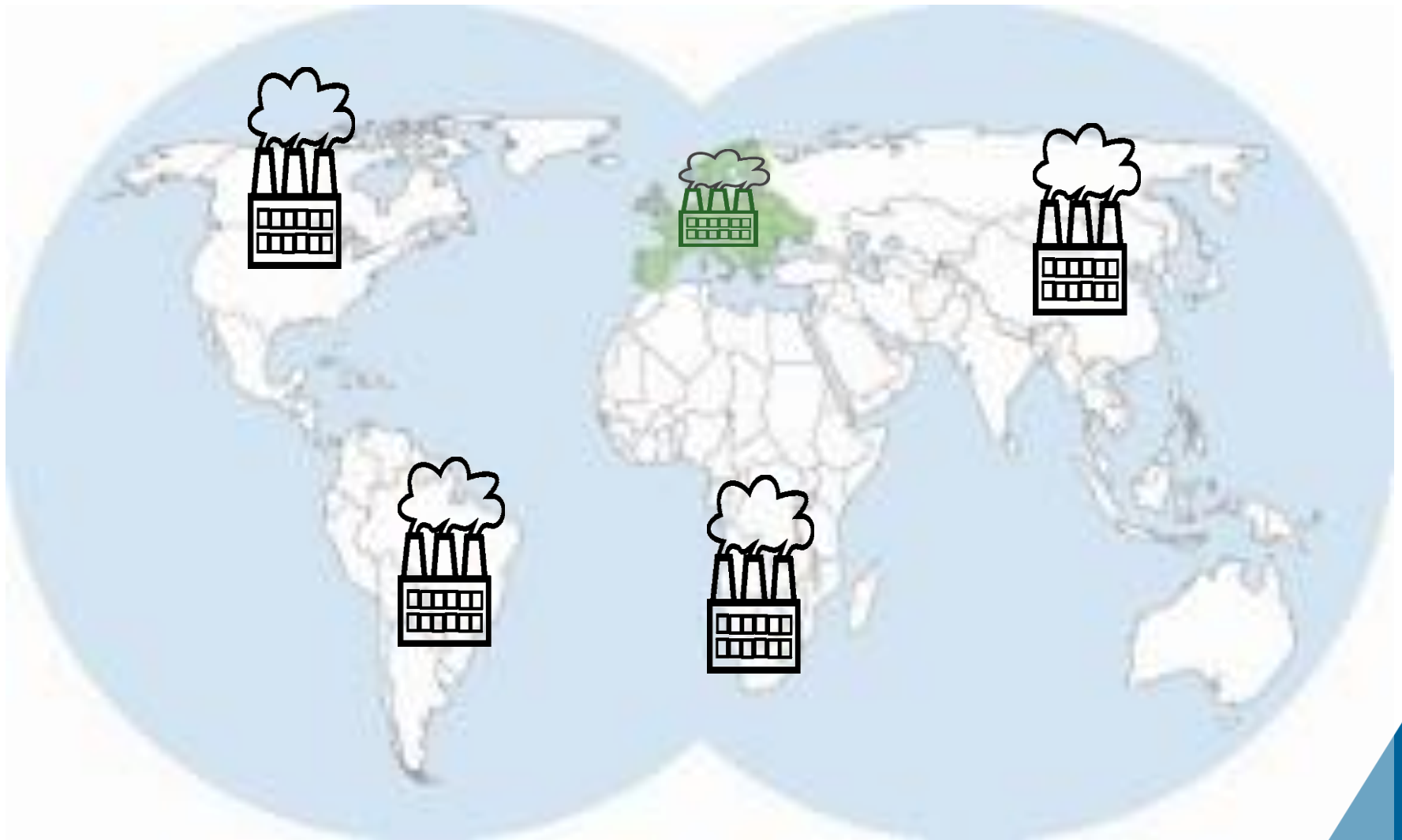


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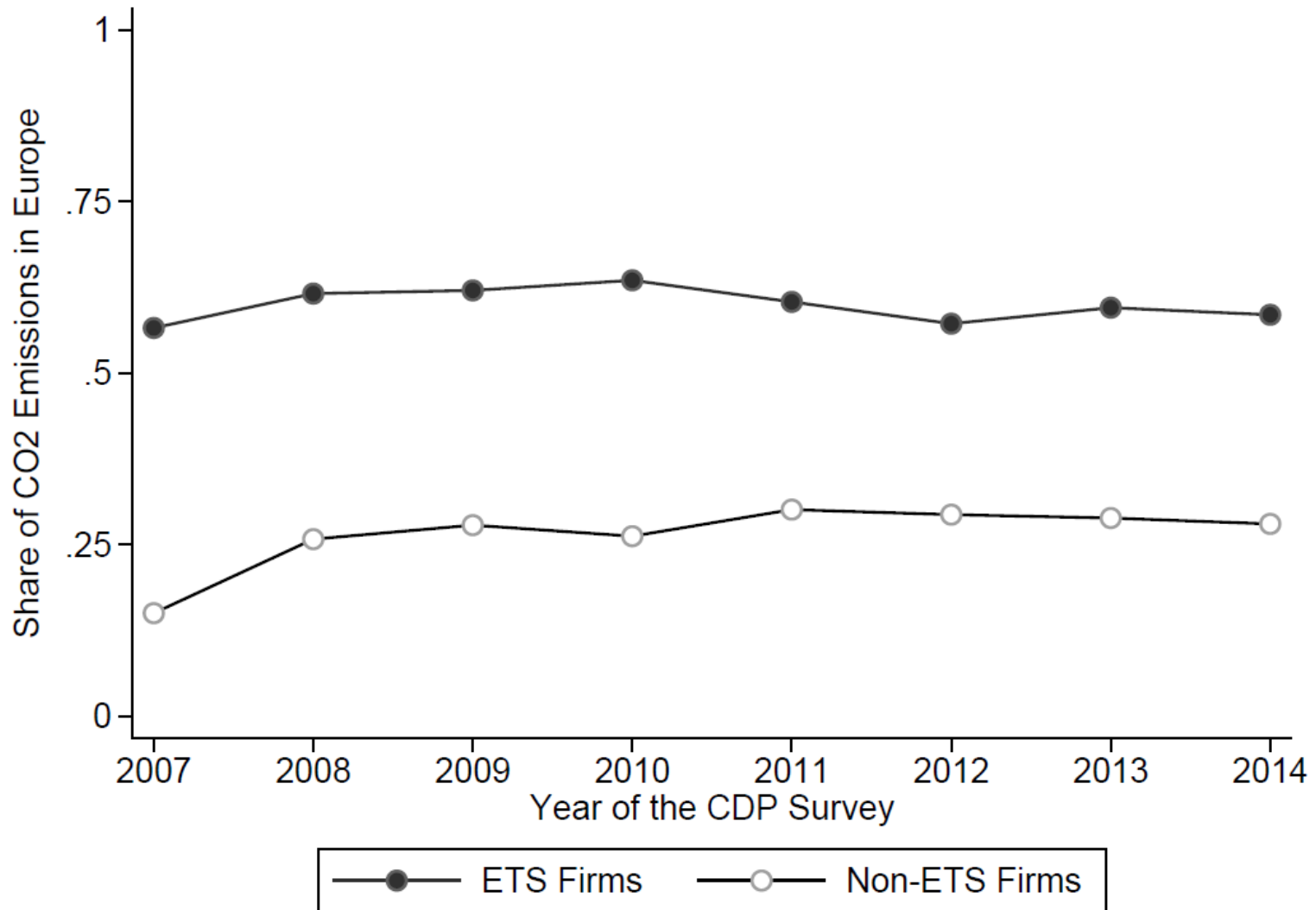


Evidence from CDP data

- Carbon Disclosure Project: firm-level carbon emissions by country
 - NGO acting on behalf of over 600 institutional investors
 - Since 2003 asked listed companies to disclose information on emissions
 - 1,041 companies, 2007-2014 (unbalanced)
- Focus on multinational companies operating both within and outside the EU
 - Should be easier for them to relocate activities



Share of EU emissions



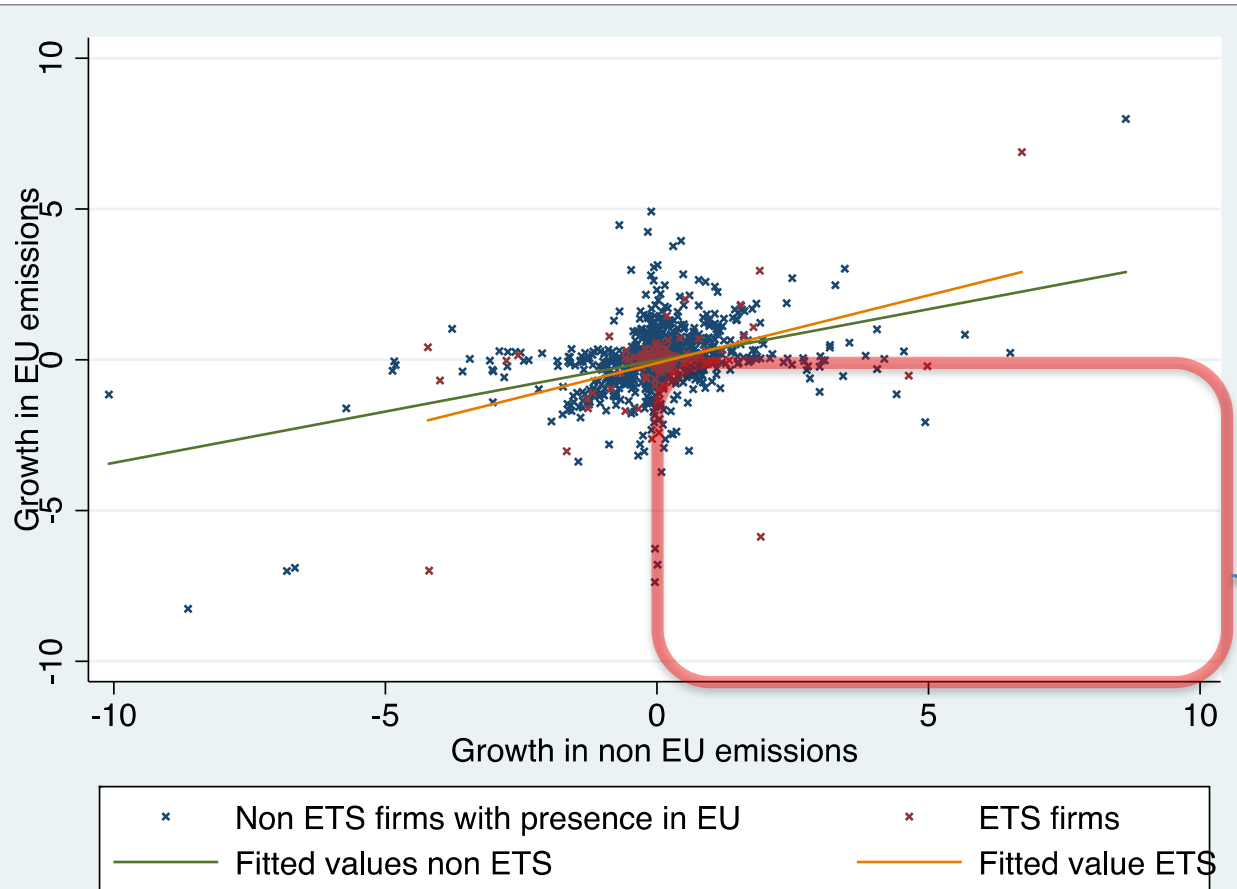


Regression results

| | (1) | (2) | (3) | (4) |
|---|------------------|------------------|------------------|------------------|
| Change in the share of EU emissions | | | | |
| <i>Panel A: All firms</i> | | | | |
| ETS Company | 0.003 (0.005) | 0.007 (0.006) | 0.010 (0.006) | 0.010 (0.006) |
| Observations | 3,772 | 2,838 | 2,366 | 2,366 |
| R-squared | 0.003 | 0.004 | 0.005 | 0.005 |
| Number of firms | 1134 | 785 | 674 | 674 |
| Number of EU ETS firms | 235 | 213 | 191 | 191 |
| <i>Panel B: Manufacturing firms</i> | | | | |
| ETS Company | 0.006 (0.006) | 0.010 (0.008) | 0.014 (0.009) | 0.014 (0.009) |
| Observations | 1,966 | 1,559 | 1,243 | 1,243 |
| R-squared | 0.003 | 0.004 | 0.007 | 0.007 |
| Number of firms | 565 | 421 | 348 | 348 |
| Number of EU ETS firms | 153 | 145 | 127 | 127 |
| <i>Panel C: Manufacturing firms at risk of carbon leakage</i> | | | | |
| ETS Company | 0.004 (0.006) | 0.008 (0.007) | 0.013 (0.009) | 0.013 (0.009) |
| Observations | 1,542 | 1,212 | 967 | 967 |
| R-squared | 0.006 | 0.008 | 0.013 | 0.013 |
| Number of firms | 446 | 336 | 277 | 277 |
| Number of EU ETS firms | 115 | 112 | 98 | 98 |



Growth of CO₂ emissions in the EU vs the rest of the World



Any
leaks
here?