



The Carbon Content of International Trade: Effects of the Kyoto Protocol

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Trade and Environment

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TRADE AND CLIMATE POLICY

FACT 1: World merchandise imports over GDP: 25% and growing

FACT 2: No world-wide price for carbon, no world-wide carbon emission cap

- ⇒ Heterogeneous carbon policies (taxes, standards, caps, ...) give rise to concerns about
- International competitiveness
 - Environmental efficiency (carbon leakage)

CARBON LEAKAGE

Special case of *pollution haven hypothesis*

- Heterogeneous (e.g. unilateral) climate policies change patterns of *comparative advantage* and lead to *relocation* of CO₂-intensive production
 - Potential implications for all factor prices and threat of deindustrialization
 - Emission reductions in ‘green’ countries may be (more than) offset by higher emissions in ‘brown’ countries

⇒ Call for *border adjustment taxes* (BAT)

(Sarkozy, Macron, Krugman, Waxman-Markey bill, ...)

26 YEARS OF CLIMATE DIPLOMACY

- ¶ 1992: Earth Summit, Rio de Janeiro. UN-FCCC established
 - Principle of “*common but differentiated responsibility*”
 - Voluntary limitations of national CO₂-emissions
- ¶ 1997: Members of UN-FCCC conclude the **Kyoto-Protocol**
 - Binding CO₂ emission targets: 5.2% below 1990 levels until 2012
 - Rules on trade of emission permits and compensation
 - 2002-2003 Countries ratify Kyoto (not US!)
 - 2005: entry into force
- ¶ 2012: Doha Amendment – prolongation of Kyoto to 2020
- ¶ 2015: **Paris Agreement**
- ¶ 2017: President Trump announces that US withdraw from Paris Agreement

LEARNING FROM KYOTO FOR THE FUTURE

(probably)

QUESTION 1: Was the Kyoto Protocol effective after all ?
[A&F: JPAM 2013]

YES

QUESTION 2: Did Kyoto commitment lower the carbon footprint of nations ?
[A&F: JEEM 2012]

NO

QUESTION 3: Have Kyoto commitments led to carbon leakage ?
[A&F: REStat, 2015]

NO

⇒ **Border Adjustment Tax (≠ carbon tariff !) would make sense**

1. Instrument to foster coalition stability
2. and to improve efficiency of carbon policies

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Introduction

Effectiveness of Kyoto

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ECONOMETRIC APPROACH

¶ Second-stage regressions

$$Y_{it} = \beta_0 + \beta_1 \text{Kyoto}_{it} + \beta_2 \mathbf{X}'_{it} + \alpha_t + \alpha_i + \varepsilon_{it}$$

$$\text{Kyoto}_{it} = \begin{cases} 1 & \text{ratification of emission cap and } t \geq \text{ratification year,} \\ 0 & \text{else.} \end{cases}$$

- Pre-treatment period: 1995-2000
- Post-treatment period: 2004-2007

¶ First-stage regressions

$$\text{Kyoto}_{it} = \alpha + \gamma \mathbf{X}'_{it} + \zeta \mathbf{Z}'_{it} + v_i + v_t + v_{it}$$

KYOTO AND ICC MEMBERSHIP

in a large panel of countries (N=133)

Dependent variable: Kyoto commitment (0,1)

Model Method	Linear probability			Long FE (4)	Probit long diff. ^a (5)
	FE (1)	FE (2)	FE (3)		
Excluded instruments					
ICC (0,1)	0.19 ^{***} (0.05)	0.11 ^{***} (0.04)	0.10 ^{***} (0.03)	0.25 ^{***} (0.07)	0.16 ^{***} (0.03)
ICC, spatial lag		0.51 ^{***} (0.10)	0.41 ^{***} (0.08)	0.37 ^{***} (0.12)	0.04 ^{***} (0.01)
Other controls			yes	yes	yes
No. of observations	1,456	1,456	1,418	266	133
Adj. R ²	0.25	0.52	0.61	0.69	

Other controls: In GDP (-), In GDP squared (+), In population (-), In manuf. in % of GDP), In agriculture in % of GDP (-), In services in % GDP (+), In stock of other IEA, Government orientation, Openness (-), WTO (-), Polity (-).

KYOTO AND CO₂ EMISSIONS

Dependent variable: ln CO₂ emissions

Method	FE-OLS (1)	FE-OLS (2)	FE-IV (3)	Long FE-OLS (4)	Long FE-IV (5)
Kyoto (0,1)	-0.17 ^{***} (0.03)	-0.06 ^{**} (0.02)	-0.10 ^{**} (0.05)	-0.09 ^{**} (0.04)	-0.12 [*] (0.07)
Kyoto, spatial lag		0.01 ^{**} (0.01)	0.02 ^{***} (0.00)	0.03 ^{***} (0.01)	0.03 ^{***} (0.01)
Other controls		yes	yes	yes	yes
No. of observations	1,456	1,418	1,418	266	266
No. of countries	133	133	133	133	133
First-stage diagnostics					
Shea's partial R^2			0.28		0.43
Hansen–Sargan J -stat (P -value)			0.44		0.71
Weak-ID test (F -stat)			19.09		37.70
Second-stage diagnostics					
Adj. R^2	0.27	0.48		0.49	
F -stat	11.99	13.85	17.44	21.40	23.09

CHANNELS OF THE KYOTO EFFECT, I

Panel	(A) Shares in energy use				(B) Shares in electricity production			
	Renewables		Fossil fuel		Coal		Alternative energy	
Dep. var.	(A1)	(A2)	(A3)	(A4)	(B1)	(B2)	(B3)	(B4)
Method	FE-OLS	FE-IV	FE-OLS	FE-IV	FE-OLS	FE-IV	FE-OLS	FE-IV
Kyoto (0,1)	1.38** (0.56)	2.41*** (0.93)	-0.67 (0.63)	-2.46** (1.16)	0.12 (0.93)	-1.43 (1.76)	1.07*** (0.27)	1.66*** (0.56)
No. of observations	1,180	1,180	1,180	1,180	1,180	1,180	1,180	1,180
No. of countries	110	110	110	110	110	110	110	110
Shea's partial R^2		0.26		0.26		0.26		0.26
Over-ID test (P -value)		0.68		0.47		0.60		0.63
Weak-ID test (F -stat)		18.80		18.80		18.80		18.80
Adj. R^2	0.29		0.17		0.06		0.17	

CHANNELS OF THE KYOTO EFFECT, II

Panel	(C) Pump prices (USD/L)				(D) Log per capita use of			
	Diesel fuel		Gasoline		Energy		Electricity	
Dep. var.	(C1)	(C2)	(C3)	(C4)	(D1)	(D2)	(D3)	(D4)
Method	FE-OLS	FE-IV	FE-OLS	FE-IV	FE-OLS	FE-IV	FE-OLS	FE-IV
Kyoto (0,1)	0.10 ^{**} (0.04)	0.22 ^{***} (0.05)	0.13 ^{***} (0.04)	0.25 ^{***} (0.05)	-0.05 ^{**} (0.02)	-0.05 [*] (0.03)	-0.04 (0.03)	-0.08 ^{**} (0.04)
No. of observations	608	608	608	608	1,180	1,180	1,169	1,169
No. of countries	127	127	127	127	110	110	109	109
Shea's partial R^2		0.28		0.28		0.26		0.26
Over-ID test (P -value)		0.61		0.32		0.36		0.21
Weak-ID test (F -stat)		20.30		20.30		18.80		18.84
Adj. R^2	0.77		0.68		0.38		0.52	

**Kyoto did affect outcomes
despite lack of enforcement and despite incomplete
and second-best implementation**

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TRADE AND CLIMATE POLICY

International Trade

- Territorial CO₂ emissions and emissions embodied in domestic absorption (consumption, investment) [= **CO₂ footprint**] can diverge
 - Patterns of comparative advantage
 - Climate policies (even reciprocal / symmetric ones!)
 - Trade policies
- Generally, changes in climate policies or trade policies will affect difference between territorial emissions and footprints of nations
- Here: Focus on **Kyoto-Protocol**

ESTIMATING CO₂ FOOTPRINTS

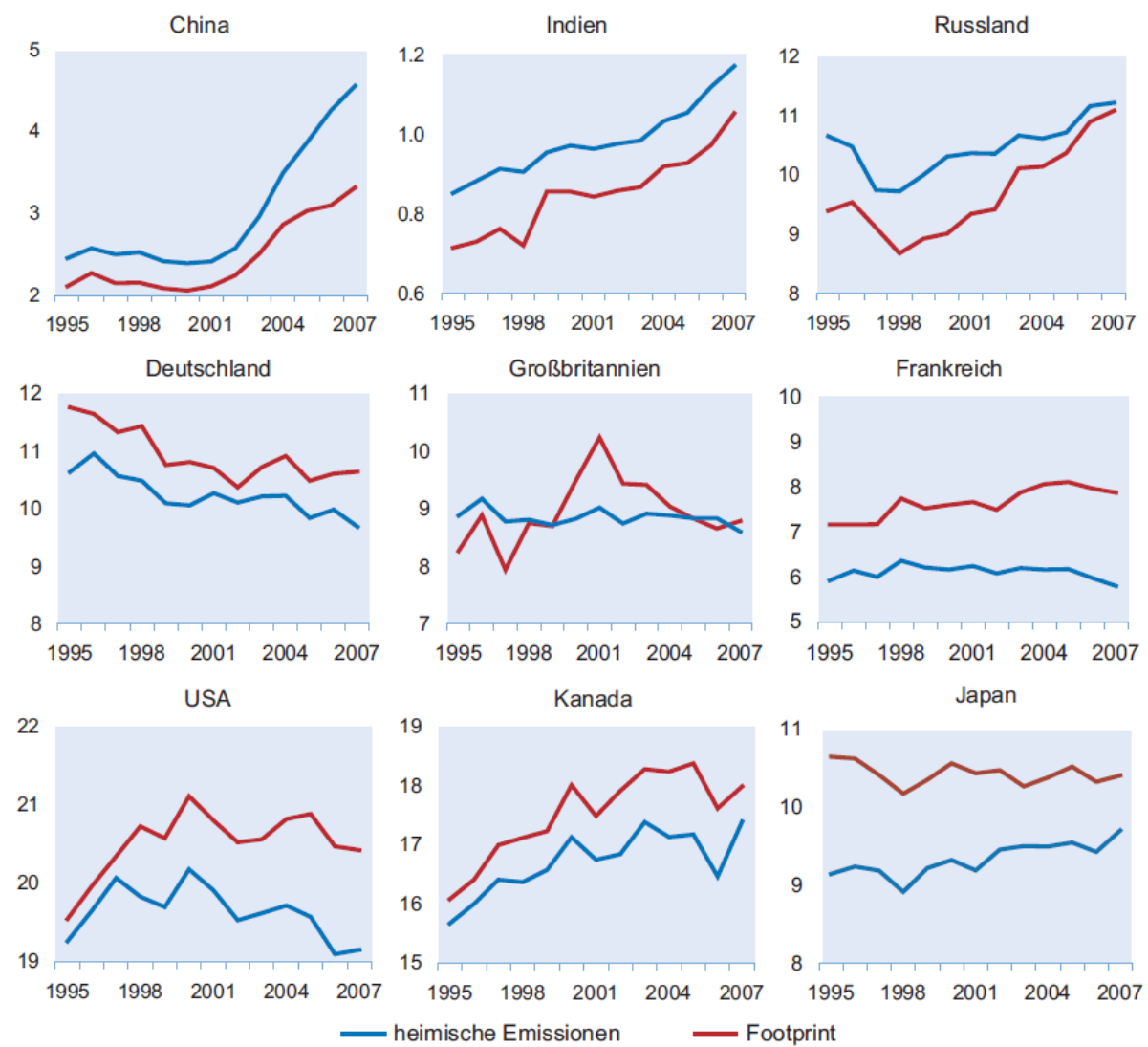
- ¶ Footprint F_{it} is the sum of territorial emissions E_{it} and emissions embodied in imports EET_{it}

$$F_{it} = E_{it} + EET_{it}$$

- ¶ Multi-region Input-Output (MRIO) table $\mathbf{B} \equiv [\mathbf{B}_{ij}]$, where \mathbf{B}_{ij} are bilateral I-O tables capturing sectoral input usage links
- ¶ Sectoral emission intensity vectors \mathbf{e}_i , and $\mathbf{e} \equiv (\mathbf{e}_1 \dots \mathbf{e}_N)$ for the world
- ¶ Vector of total carbon intensities $\mathbf{A} = \mathbf{e}(\mathbf{I} - \mathbf{B})^{-1}$
- ¶ Net emissions embodied in trade $EET_i = \mathbf{A}\mathbf{T}_i$, where \mathbf{T}_i is country i 's net trade vector
- ¶ Implemented for 40 countries using OECD and UNIDO data

FOOTPRINTS & TERRITORIAL EMISSIONS

Tonnen CO₂ pro Kopf



EMPIRICAL SETUP

¶ Second stage regressions

$$\Delta Outcome_{i,t} = \delta + \beta \Delta Kyoto_{i,t} + \xi \Delta \mathbf{X}'_{i,t} + v_{i,t},$$

$$Outcome_{i,t} \in \left\{ \ln E_{i,t}, \ln F_{i,t}, \frac{EET_{i,t}}{E_{i,t}} \right\},$$

Pre (1995-2000) and post-treatment (2004-2007) periods

¶ First stage regressions: as before (IV strategy ICC ratification and its spatial lag)

REGRESSION ANALYSIS

Dep.var.:	(1) Emissions	(2) Footprint	(7) Emissions	(8) Footprint	(9) Imports	(10) Emissions	(11) Footprint	(12) Imports
Units:	<i>Log level</i>		<i>Log per capita value</i>		Share ^a	<i>log per capita value</i>		Share ^a
Method:	FD-OLS	FD-OLS	FD-IV	FD-IV	FD-IV	FD-IV	FD-IV	FD-IV
Kyoto (0,1)	−0.08* (0.04)	−0.00 (0.04)	−0.08** (0.03)	0.03 (0.04)	0.11*** (0.03)	−0.07** (0.03)	0.06 (0.05)	0.14*** (0.04)
Log pop	1.13*** (0.36)	0.94** (0.43)						
Log GDP	0.38** (0.16)	0.47*** (0.09)	0.37** (0.16)	0.49*** (0.10)	0.10 (0.09)	0.13 (0.09)	0.36*** (0.12)	0.21* (0.11)
China (0,1)						0.30*** (0.08)	0.18*** (0.05)	−0.10 (0.07)
Polity (−10 to 10)						0.02* (0.01)	0.03*** (0.01)	0.01** (0.00)
Log stock of other MEAs						0.10 (0.11)	0.05 (0.10)	−0.10 (0.12)
EU (0,1)						−0.07* (0.04)	−0.08 (0.05)	−0.01 (0.05)
Second stage diagnostics								
Adj. R ²	0.54	0.39	0.37	0.31	0.22	0.55	0.45	0.20

Kyoto did reduce territorial CO₂ emissions, but has not affected countries' CO₂ footprints.

⇒ Non negligible role of trade

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GRAVITY FOR CARBON

The CO₂–content of imports of country m from x in sector s

$$\ln E_{mx}^s = \ln \eta_x^s + \ln Q_{mx}^s$$

- Q_{mx}^s : Quantity index of bilateral trade (*scale effect*).
Inputs-extended standard gravity.
- $\eta_x^s \equiv \mathbf{e}_x^T \mathbf{A}_x^s$: CO₂–*intensity* of imports
 - \mathbf{e}_x is the vector of sectoral emission coefficients
 - \mathbf{A}_x^s is the s –th column of $(\mathbf{I} - \mathbf{B}_x)^{-1}$, where \mathbf{B}_x is the I/O Matrix of country x
- Climate policy in m and x changes η_x^s and Q_{mx}^s

NEW DATA

- ▶ Using the theoretical model to calculate the empirical *CO₂-content of bilateral imports*
 - Sectoral trade data (UN Comtrade)
 - Harmonized panel of I/O Tables (OECD)
 - Sectoral output data (OECD STAN)
 - Sectoral CO₂ emissions (IEA)

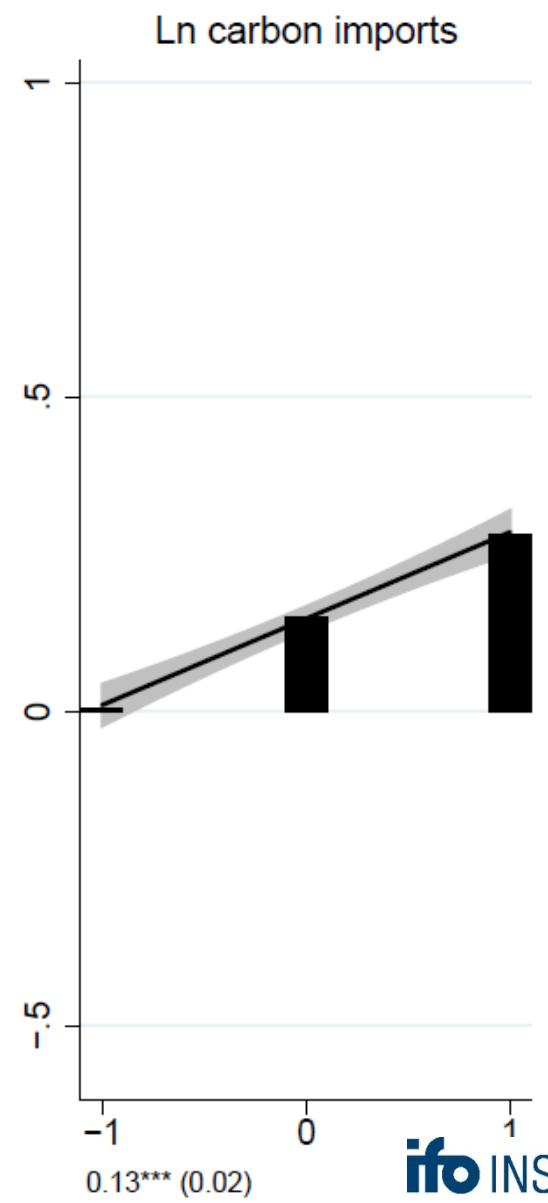
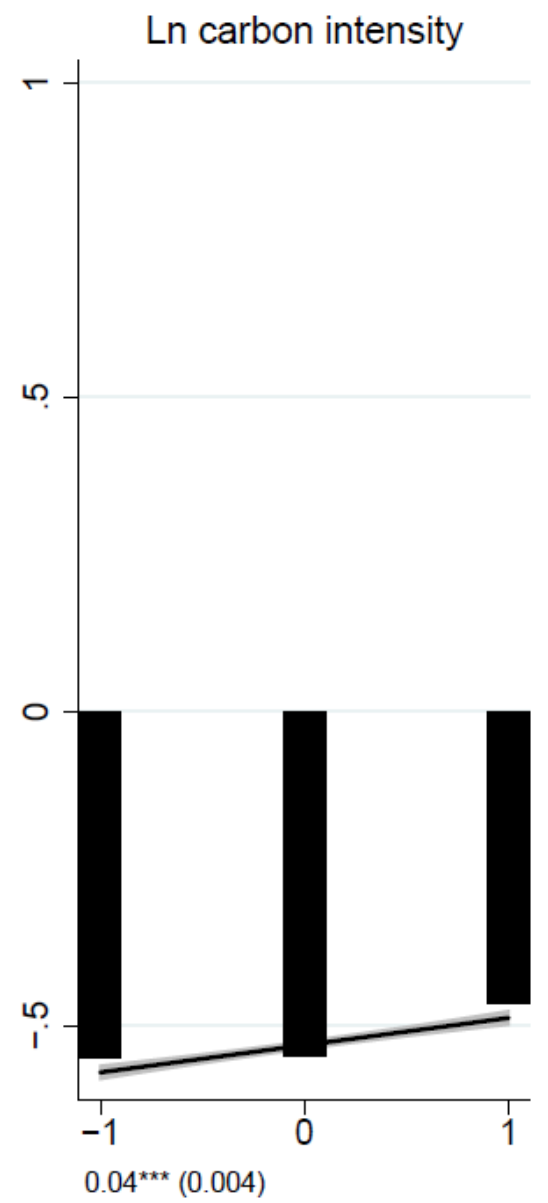
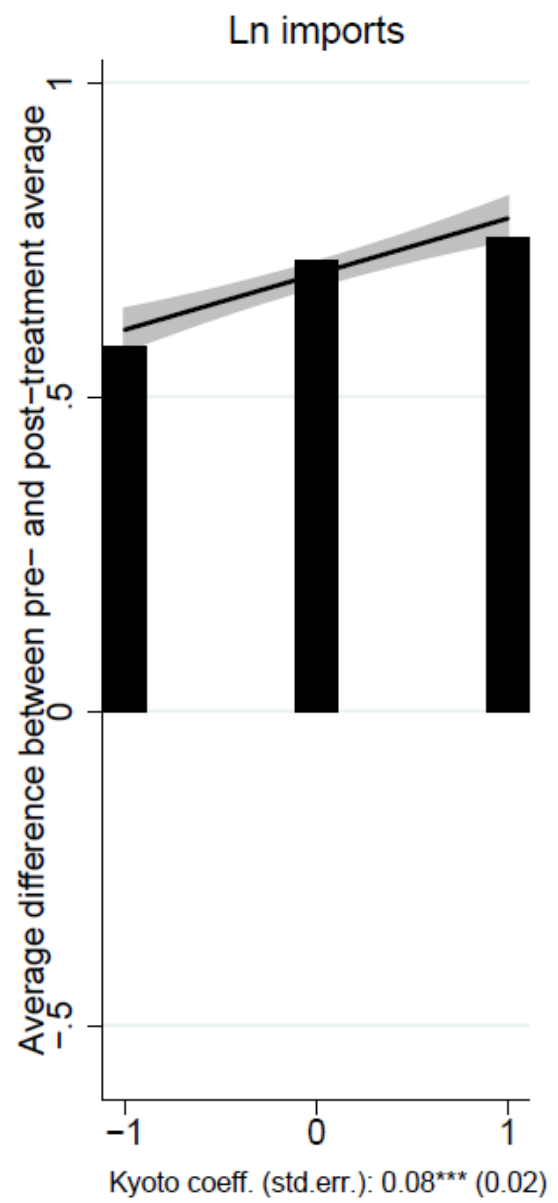
- ▶ Ein '*three-way*' panel (country pair × year × sector)
 - 40 countries, 80% of global CO₂–emissions
 - 15 sectors (12 tradeable)
 - 11 years (1997-2007)

ECONOMETRIC STRATEGY

“Long fixed-effects”=Diff-in-Diff

- ▶ Dummy $KYOTO_{mt} = 1$ if Kyoto Protocol was *ratified* in country m at time t *ratifiziert* and country had committed to a binding emission ceiling
- ▶ Identification over **time vaiance** in country-sector-pairs: pre-treatment (1997-2000), post-treatment (2004-2007)
- ▶ Differencing eliminates bilateral and country-specific time-invariant components of trade

DIFF-IN-DIFF POOLED DATA



CAUSAL EFFECTS

sector-specific panel estimators

- Three dependent variables: $Y = (E_{mxt}, Q_{mxt}, \eta_{xt})$

$$\ln Y_{mxt} = \beta (KYOTO_{mt} - KYOTO_{xt}) + \gamma POL_{mxt} \\ + \nu_x \times \nu_t + \nu_m \times \nu_t + \nu_m \times \nu_x + \varepsilon_{mxt}$$

- Interactions between year and exporter/importer dummies with the objective to control for
 - ... multilateral trade costs (third country effects),
 - ... the selection of countries into the Protocol and
 - ... country-specific (and global) trends (in a non-parametric manner)
- Identification assumption

$$\text{cov}(KYOTO_{mt} - KYOTO_{xt}, \varepsilon_{mxt} | X_{mxt}) = 0$$

BASELINE RESULTS

Dependent Variable	(1) Ln Imports, Q_{mx}	(2) Ln CO ₂ Intensity of Imports, η_x	(3) Ln CTT, η_x/η_m	(4) Ln CO ₂ Imports, E_{mx}
DKyoto _{mx}	0.050*** (0.011)	0.028*** (0.003)	-0.043*** (0.005)	0.078*** (0.011)
Joint FTA membership	0.103*** (0.031)	0.010 (0.008)		0.113*** (0.032)
Joint WTO membership	-0.144 (0.163)	-0.001 (0.036)		-0.144 (0.165)
Joint EU membership	0.019 (0.035)	0.019** (0.009)		0.038 (0.035)
Country × Year Effects	Yes	Yes	Yes	Yes
Country pair-sector effects	Yes	Yes	Yes	Yes
Observations	223,499	223,499	215,917	223,499
Number of country pair-sectors	18,588	18,588	18,387	18,588
Adjusted R^2	0.206	0.709	0.036	0.074
F -statistic	46.316	879.091	11.691	15.245
RMSE	0.829	0.179	0.305	0.849

SECTOR-LEVEL RESULTS

Dependent Variable Method	(1) Ln Imports		(3) Ln CO ₂ Intensity		(5) Ln CO ₂ Imports	
	FE	Long FE	FE	Long FE	FE	Long FE
(3) Basic metals	0.20*** (0.04)	0.21** (0.08)	-0.00 (0.01)	0.01 (0.01)	0.20*** (0.04)	0.21** (0.08)
(9) Paper, paper products, pulp and printing	0.15*** (0.04)	0.16** (0.07)	0.02*** (0.01)	0.04*** (0.01)	0.17*** (0.04)	0.19*** (0.07)
(6) Transport equipment	0.15*** (0.04)	0.18** (0.08)	0.01 (0.01)	0.01 (0.02)	0.16*** (0.04)	0.21** (0.09)
(7) Machinery	0.13*** (0.02)	0.10** (0.05)	0.01 (0.01)	0.00 (0.02)	0.15*** (0.03)	0.11** (0.05)
(5) Other nonmetallic mineral products	0.14*** (0.03)	0.17*** (0.07)	-0.00 (0.01)	0.00 (0.02)	0.14*** (0.03)	0.18** (0.07)
(2) Electricity, energy, mining and quarrying	0.08 (0.06)	0.14 (0.12)	0.05*** (0.01)	0.10*** (0.02)	0.13** (0.06)	0.24** (0.12)
(12) Non-specified industries	-0.01 (0.02)	-0.02 (0.04)	0.09*** (0.01)	0.11*** (0.02)	0.09*** (0.03)	0.10** (0.05)
(4) Chemicals and petrochemicals	0.02 (0.03)	0.02 (0.05)	0.06*** (0.01)	0.07*** (0.02)	0.08*** (0.03)	0.09* (0.06)
(8) Food products, bever- ages, tobacco	0.01 (0.03)	0.06 (0.07)	0.01** (0.01)	0.03** (0.01)	0.02 (0.04)	0.10 (0.08)
(1) Agriculture, forestry, fishing	-0.04 (0.04)	-0.02 (0.08)	0.02*** (0.01)	0.06*** (0.01)	-0.02 (0.04)	0.05 (0.08)
(10) Wood and wood products	-0.10** (0.05)	-0.15 (0.09)	0.02** (0.01)	0.05*** (0.02)	-0.08* (0.05)	-0.09 (0.09)
(11) Textile and leather	-0.12*** (0.03)	-0.19*** (0.06)	0.02*** (0.01)	0.03* (0.02)	-0.09*** (0.03)	-0.15** (0.06)

Kyoto did increase imports from non-committed countries, the carbon intensity of imports, and the carbon content of imports

IMPLICATIONS FOR POLICY

- **Carbon leakage** is a real possibility and it is quantitatively relevant
- **Need border adjustment tax (BAT)** to stabilize coalition of the willing and to improve effectiveness / efficiency
- Common but differentiated responsibility: **rebate BAT income**
- **New free trade agreements**: link CO₂-emission trading systems, harmonize CO₂ taxes, allow for BAT

CURRENT ifo RESEARCH

- **Effects of FTAs** on CO2 emissions worldwide
 - Ex post analysis (EU-Korea for the EU Commission)
 - Ex ante analysis, with and without BATs
- **Excessive and inefficient international trade** due to non-internalization of transportation related CO2 emissions: Analysis using an NQTM
- **Role of trade linkages in mitigating damage caused by global warming**