

# The network effects of carbon pricing

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1 Motivation

2 The model

3 Results

**Macroeconomic costs** and **competitive drawbacks** are prominent obstacles to the introduction of carbon pricing.

With interconnected industries (GVC), carbon pricing potentially affects:

- 1 emission-intensive industries
- 2 industries connected to high-carbon value chains

**Network effects** of carbon pricing:

- 1 Propagation of (price-induced) demand shocks
- 2 Recomposition of the global production network (Whalley and Wigle 1991)

# Motivation

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## Research questions

- How does a price on carbon emissions affect the structure of GVC?
- Which sectors or countries bear the cost of GVC reconfigurations?

- 1 A **production network approach** to carbon pricing impacts
  - Multi country-sector model with price substitution  
(Baqaei and Farhi 2019; Devulder and Lisack 2020; Frankovic 2022; Sager 2021)
  - Network effects: price substitution vs. contagion of demand shocks
  - A GVC positioning perspective: input-output analysis tools

- ① A **production network approach** to carbon pricing impacts
  - Multi country-sector model with price substitution  
(Baqaei and Farhi 2019; Devulder and Lisack 2020; Frankovic 2022; Sager 2021)
  - Network effects: price substitution vs. contagion of demand shocks
  - A GVC positioning perspective: input-output analysis tools
- ② **Results:** complex network and policy interactions
  - Carbon tax shifts network centrality away from carbon-intensive countries and countries trading with them
  - Unilateral policy: increases marginalization, even with burden-sharing policies (border tax)

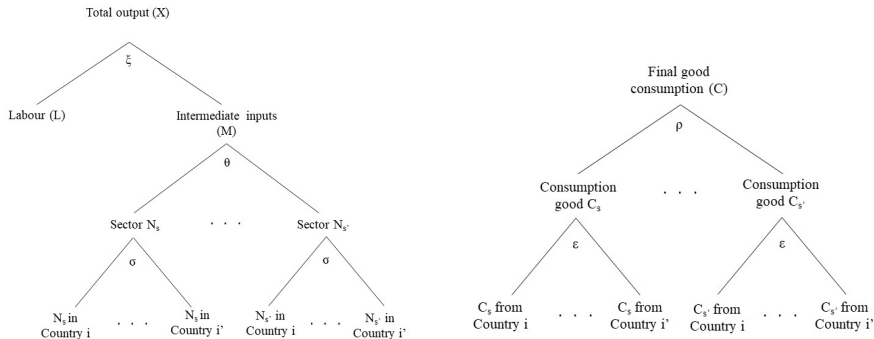
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## Multi-sector open-economy model with firms ( $\mathcal{C} \times \mathcal{S}$ ) and households ( $\mathcal{C}$ )

- Firms: total output production with input bundle  $M$  and labor  $L$   
 $\Rightarrow$  Nested CES: elasticities  $\xi$  (labor/inputs),  $\theta$  (sectors) and  $\sigma$  (countries)
- Households: consumption bundle  $C$  of final goods  
 $\Rightarrow$  Nested CES: elasticities  $\rho$  (sectors) and  $\varepsilon$  (countries)





Carbon tax induces **price** and **output** adjustments in the economy:

- New prices:  $p_{si}^{new}(\mathbf{T}, \mathbf{A})$  with  $\underbrace{\mathbf{T} = \{\tau_{si(\omega)}\}}_{\text{tax on direct emissions}}$  and  $\underbrace{\mathbf{A} = \{a_{si(\omega)}\}}_{\text{input-output matrix}}$

- Firm-level adjustments to  $p^{new}$  in inputs:

$$a_{si}^{new} = \alpha_M \alpha_s \alpha_{si} \left( \frac{p^{new}}{p_M^{new}} \right)^\xi \left( \frac{p_M^{new}}{p_{Ns}^{new}} \right)^\theta \left( \frac{p_{Ns}^{new}}{p_{si}^{new}} \right)^\sigma$$

- Consumers' reaction to  $p^{new}$  in final goods:

$$G_{si}^{new} = \frac{c_{si}^{new}}{C^{new}} = \gamma_s \gamma_{si} \left( \frac{p_C^{new}}{p_{Cs}^{new}} \right)^\rho \left( \frac{p_{Cs}^{new}}{p_{si}^{new}} \right)^\varepsilon$$

# Counterfactual simulations

- Data: World Input-Output Database (WIOD)  
⇒ 44 countries and 56 productive sectors
- Calibration:
  - Elasticities: literature in trade and production networks  
⇒ [Atalay 2017](#); [Baqee and Farhi 2019](#)
  - Techno. requirements ( $\alpha$ ) and consumption pref. ( $\gamma$ ): WIOD
- We run 3 carbon pricing scenarios (40\$/tCO<sub>2</sub>):
  - 1 global tax
  - 2 EU (production)
  - 3 EU + CBAM (production + borders)
- Revenue recycling: collected and distributed to domestic consumers

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# Baseline results

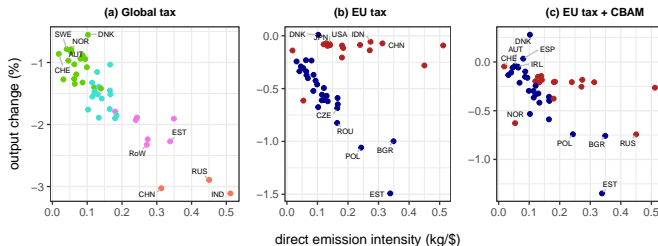
## CO<sub>2</sub> emissions and economic impacts - world level

- Global tax vs. EU production tax vs. EU + CBAM tax:
  - Global carbon emissions: -4.5% vs. -0.3% vs. -0.4%
  - Average output change: -1.9% vs. -0.17% vs. -0.21%

## Distribution of costs - country level

sectoral level

clustering



country group

- very high emissions
- low emissions
- moderate emissions
- high emissions

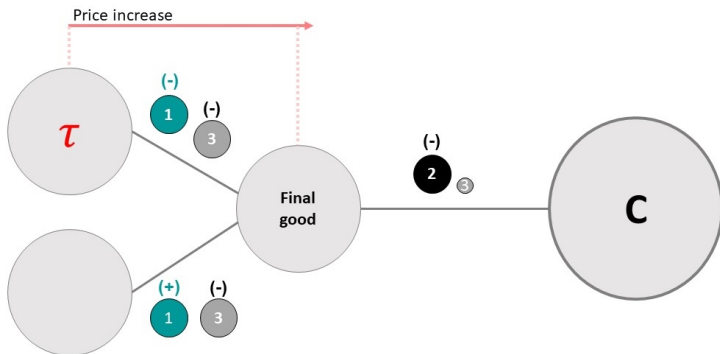
country group

- EU
- non-EU

# Network effects - drivers

What are the drivers of output loss?

- 1 **Input substitution** effect: direct changes in intermediate demand (firms)
- 2 **Direct final demand** effect: direct changes in final demand (consumers)
- 3 **Downstream final demand** effect: changes in intermediate demand induced by changes in final demand

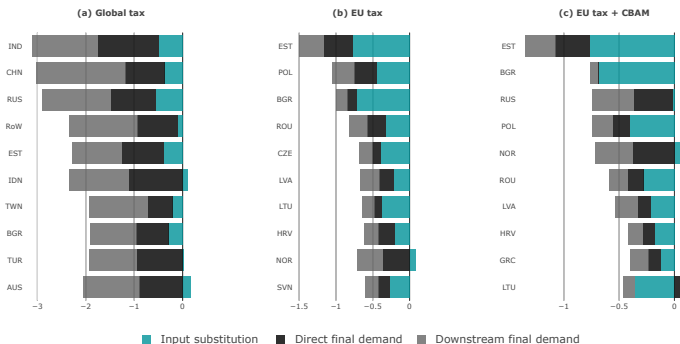


# Network effects - numerical results

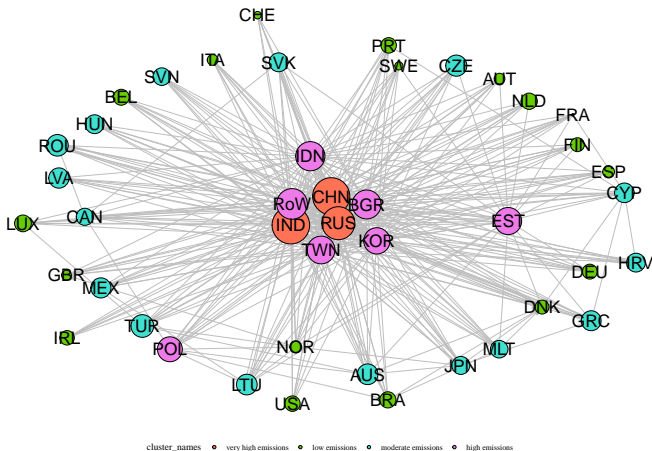
## Dominant effects:

- 1 Global tax: demand effects
- 2 EU and EU+CBAM tax: input substitution responsible for most losses

⇒ Relative competitiveness losses are sharper in unilateral policy scenarios

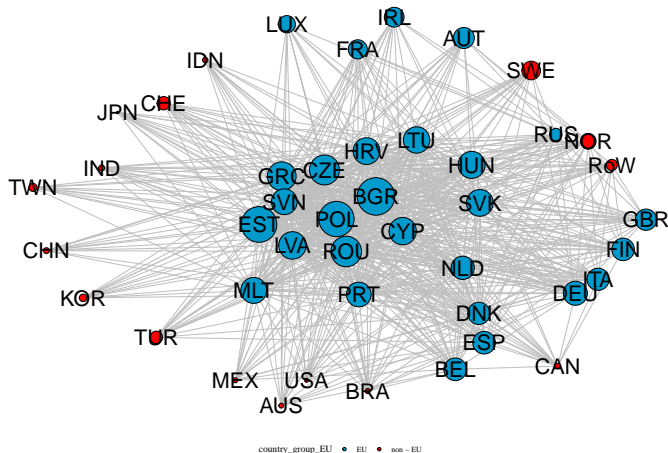


# Focus: input substitution (global)



Edges:  $\Delta\%$  in intermediate trade  $> 2$ ; Nodes:  $\Delta\%$  in total output

# Focus: input substitution (EU+CBAM)



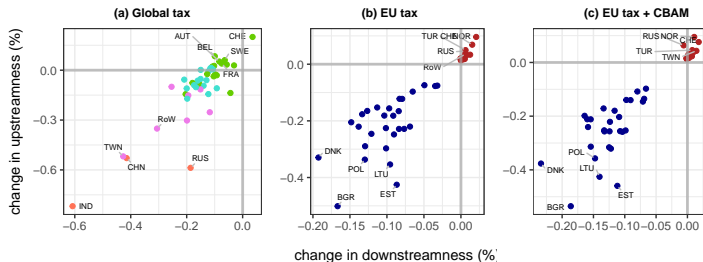
Edges:  $\Delta\%$  in intermediate trade  $> 0.7$ ; Nodes:  $\Delta\%$  in total output



# Network effects - GVC recomposition

A closer look at **GVC positions** (downstreamness/upstreamness): [details](#)

- Highly-emitting countries and connected countries: **marginalization**
- **Unilateral** EU tax shifts network towards non-EU countries (scen. 2&3)
- Adding CBAM doesn't help EU GVC marginalisation



country group

- very high emissions
- low emissions
- moderate emissions
- high emissions

country group

- EU
- non-EU

- ① Carbon pricing: potential cascades of price changes and output loss
  - Both direct and indirect (imported) emissions matter
  - Firms and households substitute away from carbon-intensive inputs
- ② Macroeconomic impacts - winners and losers
  - GVC positioning and policy shape network effects
  - Carbon pricing reconfigures GVC
- ③ Coming work: policy!
  - Can a policy-maker counter GVC marginalization?
  - Recycling policies are key for welfare/competitiveness
  - Endogenizing policy: 'cascades' of policy decisions



**Thank you!**

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# Support slides

# Sensitivity - elasticity parameters <sup>(1/2)</sup>

Output and emissions changes are increasing with elasticity parameters

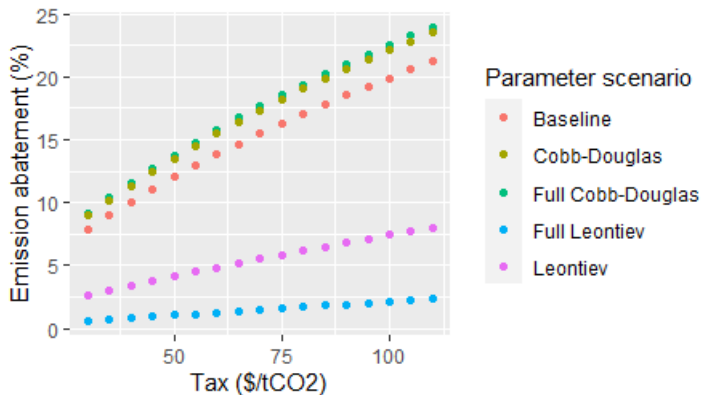
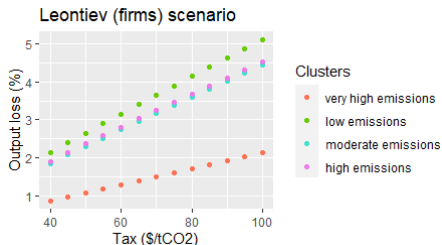
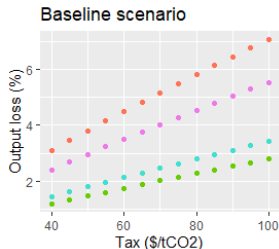


Figure: Sensivity analysis: tax range and parameter space

# Sensitivity - elasticity parameters (2/2)

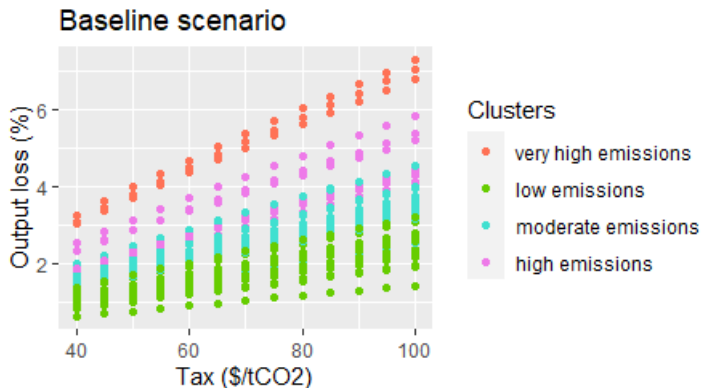
Winners and losers are parameter-dependent clustering

- Increased rigidity in the input market: higher price increase contagion
- **Hypothesis:** less emitting countries are closer to final demand  
⇒ Downstream price propagation + no substitution ↑ negative demand effects



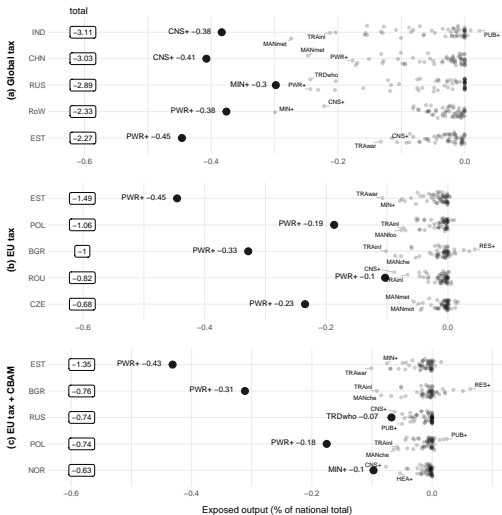
# Sensitivity - tax range

- Absence of strong non-linear effects in increasing tax rate
- Increased variance in economic costs!



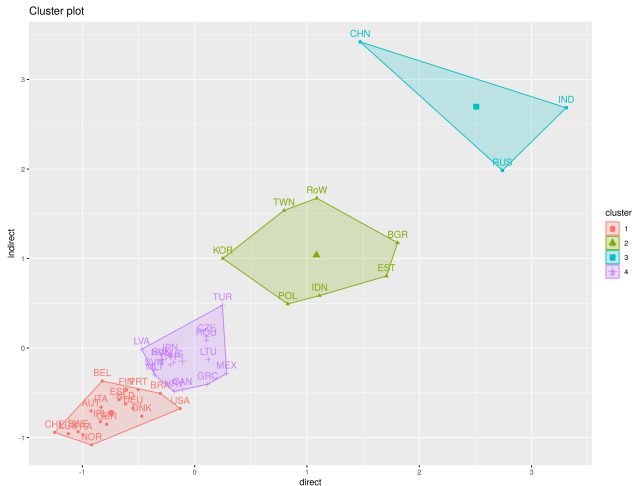
**Next steps:** does this translate into network statistics (centrality, degree, etc.)?

# Sectoral distribution of costs [back](#)





- Direct emissions: own emission intensity
- Indirect emissions: emissions intensity implied by the value chain



## Upstreamness - total forward linkages

- Average 'distance' from final use (Antràs et al. 2012; Miller and Temurshoev 2017)

$$u_i = 1 \cdot c_i + 2 \cdot \sum_j \alpha_{ij} c_j + 3 \cdot \sum_{j,k} \alpha_{ik} \alpha_{kj} c_j + 4 \cdot \sum_{j,k,l} \alpha_{il} \alpha_{lk} \alpha_{kj} c_j + \dots$$

## Downstreamness - total backward linkages

- Average 'distance' from primary inputs (labor) (Miller and Temurshoev 2017)
- Average number of production stages (Fally 2012)

$$d_i = 1 \cdot \kappa_i + 2 \cdot \sum_j \alpha_{ij} \kappa_j + 3 \cdot \sum_{j,k} \alpha_{ik} \alpha_{kj} \kappa_j + 4 \cdot \sum_{j,k,l} \alpha_{il} \alpha_{lk} \alpha_{kj} \kappa_j + \dots$$

Notation:  $c_i$  final goods,  $\kappa_i$  value-added (labor),  $\alpha$  technical coefficients.

- Economy populated with  $\mathcal{C} \times \mathcal{S}$  representative firms
- Firms produce with a set of factors  $F$  and a bundle of intermediate inputs  $M$ , using technology

$$X = \left( \alpha_L^{\frac{1}{\xi}} L^{\frac{\xi-1}{\xi}} + \alpha_M^{\frac{1}{\xi}} M^{\frac{\xi-1}{\xi}} \right)^{\frac{\xi}{\xi-1}} \quad (1)$$

- Interm. input bundle (double-nested CES) jointly defined by

$$M = \underbrace{\left( \sum_s \alpha_s^{\frac{1}{\theta}} N_s^{\frac{\theta-1}{\theta}} \right)^{\frac{\theta}{\theta-1}}}_{\text{sectors}}, \quad N_s = \underbrace{\left( \sum_i \alpha_{si}^{\frac{1}{\sigma_s}} f_{si}^{\frac{\sigma_s-1}{\sigma_s}} \right)^{\frac{\sigma_s}{\sigma_s-1}}}_{\text{countries}}$$

- Firms minimise output costs  $\Gamma = wL + \sum_{s,i} p_{si} f_{si}$

- Economy populated with  $\mathcal{C}$  representative households
- Households consume a bundle of final goods  $C$  defined by

$$C = \underbrace{\left( \sum_{s \in \mathcal{S}} \gamma_s^{\frac{1}{\rho}} c_s^{\frac{\rho-1}{\rho}} \right)^{\frac{\rho}{\rho-1}}}_{\text{sectors}}, \quad C_s = \underbrace{\left( \sum_{i \in \mathcal{C}} \gamma_{si}^{\frac{1}{\varepsilon_s}} c_{si}^{\frac{\varepsilon_s-1}{\varepsilon_s}} \right)^{\frac{\varepsilon_s}{\varepsilon_s-1}}}_{\text{countries}}$$

- Budget constraint is

$$P_C C = w \sum_s L_s + T$$

where revenues are generated from:

- Supplying labour  $L$  at rate  $w$
- Receiving lump-sum taxes  $T$  from carbon pricing

- Optimal consumption of input and final goods  $\{s, i\} \in \mathcal{S} \times \mathcal{C}$  yields a linear relationship between input and output<sup>1</sup>

$$\mathbf{x} = (\mathbf{I} - \mathbf{A})^{-1} \mathbf{c}$$

where:

- $\mathbf{x}$  is the vector of country-sector output
- $\mathbf{c}$  is the vector of final demand
- $\mathbf{A}$  is the matrix of technical coefficients
- Important: both  $\mathbf{A}$  and  $\mathbf{c}$  are *price-dependent*
- We normalise prices to 1 to keep the model in real terms

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<sup>1</sup>The 'Leontiev inverse' can be decomposed as a power series, such that  $(\mathbf{I} - \mathbf{A})^{-1} = \mathbf{I} + \mathbf{A} + \mathbf{A}^2 + \dots$ ; this is the basis for the decomposition of the stranding cascades hereafter.

- Emissions  $\delta_{si}$  are taxed by country-sector  $\omega$  at rate  $\tau_{si(\omega)}$
- Given the intermediate input market structure  $\mathbf{A}$ , the new price of input  $\{s, i\}$  for other firms should encompass:
  - (i) *direct* emission costs:  $\delta_{si}\tau_{si(\omega)}$
  - (ii) *indirect* emission costs resulting from buying inputs further up the supply chain
- New intermediate input prices are therefore given by<sup>2</sup>:

$$p_{si(\omega)}^{new} = \underbrace{1}_{\text{normalised price}} + \underbrace{\delta_{si}\tau_{si(\omega)}}_{\text{direct emissions}} + \underbrace{\sum_j \sum_k \tau_{j(k)} a_{j(k)} l_{k(si)} \delta_j}_{\text{indirect emissions}}$$

<sup>2</sup>All  $\{s, i\}, \omega, j, k \in \mathcal{S} \times \mathcal{C}$

New prices distort the *structure of the intermediate inputs market*

- $\mathbf{A}^{new}$  with elements

$$a_{si}^{new} = \alpha_M \alpha_s \alpha_{si} \left( \frac{P^{new}}{P_M^{new}} \right)^\xi \left( \frac{P_M^{new}}{P_{Ns}^{new}} \right)^\theta \left( \frac{P_{Ns}^{new}}{P_{si}^{new}} \right)^\sigma$$

- Price indices  $P_M^{new}$  and  $P_{Ns}^{new}$  contain a weighted average of input prices w.r.t. sectors and countries
- $a_{si}^{new}$  coefficients are *deflated* from new prices

New prices affect *households consumption patterns*

- New share allocated to good  $c_{si}$  by country  $n$  is given by

$$\frac{c_{si}^{new}}{C^{new}} = \gamma_s \gamma_{si} \left( \frac{P_C^{new}}{P_{Cs}^{new}} \right)^\rho \left( \frac{P_{Cs}^{new}}{P_{si}^{new}} \right)^{\varepsilon_s}$$

- Price indices  $P_C^{new}$  and  $P_{Cs}^{new}$  contain a weighted average of input prices w.r.t. sectors and countries



- Changes in revenues after carbon pricing is introduced:

$$P_C^{new} C^{new} = r \sum_s K_s^{new} + w \sum_s L_s^{new} + T^{new}$$

- Tax revenues  $T^{new}$  are collected at the country level and allocated to households
- Revenues from capital and labour  $rK^{new}$  and  $wL^{new}$  are collected by domestic households

## New equilibrium output

$$\mathbf{x}^{new} = (\mathbf{I} - \mathbf{A}^{new})^{-1} \mathbf{c}^{new}$$