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# Measuring Leakage Risk <sup>†</sup>

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# Motivation

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- The global nature of the climate change problem creates challenges for regional climate change policies.
- Policy-induced increases in firms' operating costs can cause emissions 'leakage' into less stringently regulated jurisdictions.
- Researchers are exploring policy design alternatives to mitigate this emissions leakage.

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- Economists have shown how output-based allocation of emissions allowances can – in theory– be used to mitigate emissions leakage in a regional GHG emissions trading program (e.g., Fischer and Fox (2007); Fowlie, Reguant, and Ryan (2016)).
- Policy makers in California, Europe, and elsewhere are putting this theory into practice.
- Allowance allocation updating comes at a cost, so it is important that output-based allocation updating is targeted judiciously.

# Leakage mitigation in practice

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- Efficient targeting of leakage mitigating subsidies requires policy makers to identify industries facing high leakage risk during the policy implementation phase.
- Emissions leakage mitigation comprises an important component of California's landmark Greenhouse Gas Emissions Trading Program.
- Our analysis aims to inform the process by which policy makers assess leakage risk and target emissions leakage mitigation.

# Our objectives

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- 1 Develop an analytical framework to inform the design of emissions leakage risk metrics and associated leakage mitigating subsidies.
- 2 Estimate key parameters that determine the extent to which *international* emissions leakage could manifest.
- 3 Use these empirical estimates to calibrate intuitive measures of leakage risk and output-based leakage mitigation.

# Our scope

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- Two companion studies focus on *intra-national*, inter-state emissions leakage (the primary leakage channel in some sectors).
- International market transfers could be significant in industries where international imports and exports play an important role.
- We use our framework to assess the potential for *international* emissions leakage to jurisdictions outside the United States.

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The report develops a conceptual framework useful for:

- Identifying the key factors that determine the extent to which leakage could occur in a given industry.
- Demonstrating how output-based updating can be used to mitigate leakage.
- Deriving an intuitive measure of leakage risk and leakage mitigation.

Provide only a brief overview in this short presentation. More details can be found in our report.

# Key concepts

- **Emissions leakage** refers to change in emissions in outside jurisdictions that is caused by the introduction of a regional emissions regulation.
- **Market transfer rate:** measures the change in production levels in outside jurisdictions associated with a policy-induced change in production at regulated entities.
- **Output-based leakage rate** can be expressed as the market transfer rate multiplied by the marginal emissions rate among outside/unregulated producers:

$$\text{unregulated emissions rate} \times \frac{\text{change in unregulated production}}{\text{change in regulated production}}$$

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# Key intuition

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- Emissions leakage occurs when the policy-induced increase in operating costs causes regulated producers to lose market share to un/less regulated rivals.
- Allocating allowances on the basis of output confers an *implicit production subsidy* which offsets some share of compliance cost impacts, thus reducing/eliminating market transfer.
- Intuitively, the size of this implicit production subsidy (measured in terms of free allowances) should reflect the output-based emissions leakage rate.

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- The conceptual framework focuses our attention on the market transfer rate as a key determinant of emissions leakage and output-based subsidies.
- Using rich transaction and establishment-level data, we estimate elasticities of imports, exports, and domestic production with respect to domestic energy costs (controlling for other factors such as labor costs and foreign energy costs).
- With these estimates in hand, we can calibrate an upper-bound estimate of the industry-specific market transfer rate (focusing on international transfers).

Table 1: Relevant Data Sets

Data Set	Main Variables	Level Aggregation	Years	Notes
Longitudinal Firm Trade Transactions Database (LFTTD)	Value of transaction, product HS code, U.S. firm in trade, port of entry/exit, country of origin/destination	Transaction	1993–2011	Restricted
Census of Manufacturers (CMF)	Value of shipments, value and quantity of electricity purchased, value of primary fuels purchased, wages, input costs, capital intensity	Establishment-Year	1997, 2002, 2007, 2012	Restricted
Annual Survey of Manufacturers (ASM)	Same as CMF	Establishment-Year	1993–2012 (excluding CMF years)	Restricted
Longitudinal Business Database (LBD)	Establishment-to-firm linkage	Establishment-Year	1993–2012	Restricted
Manufacturing Energy Consumption Survey (MECS)	Primary energy consumption by fuel type	Industry-Region-Year	1998, 2002, 2006, 2010	Public
State Energy Data System (SEDS)	Primary energy price by fuel type	State-Year	1993–2012	Public
Enerdata Global Energy Data	Foreign electricity and natural gas prices	Country-Year	1989–2011	Proprietary
IEA Energy Prices and Taxes	Foreign electricity and natural gas prices	Country-Year	1989–2011	Proprietary

Source: Own elaboration.

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# Key variables

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## Outcome variables (measured in \$2010 USD):

- Annual value of domestic shipments
- Annual value of imports
- Annual value of exports

## Explanatory variables:

- Weighted average annual domestic energy prices (industry-specific)
- Weighted average annual foreign energy prices (industry-specific)
- Energy intensity (energy costs as a share of total input costs).
- Emissions intensity (metric tons of  $CO_2$ /MMBtu and /\$ shipments.
- Weighted average annual labor costs (industry-specific)
- California value share (industry-specific)
- Capital share (industry-specific)

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- We estimate the changes in outcomes (domestic production, imports, and exports) associated with changes in relative energy-related operating costs, controlling for other factors (e.g. foreign energy prices, labor costs).
- Regression analysis yields elasticity measures, which can be interpreted as the percentage change in an outcome associated with a percent change in energy-related operating costs (controlling for other factors).
  - Estimating equation
- These elasticities vary systematically with industry characteristics (i.e., energy intensity, capital intensity).

# Many empirical challenges!

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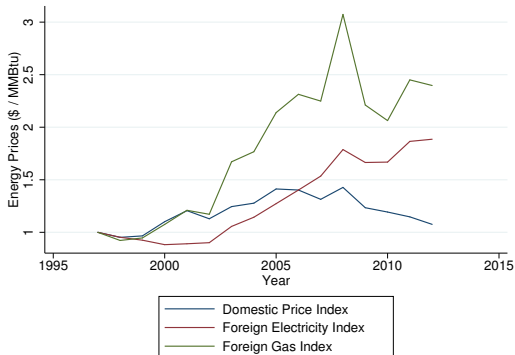
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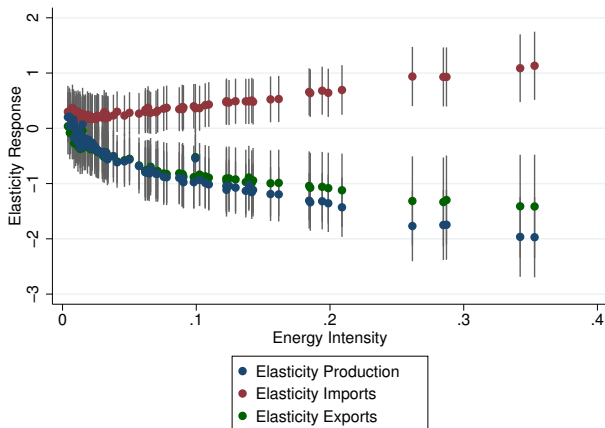
- Economic theory yields clear predictions but not specific instructions about how to specify estimating equations.
- Policy-induced changes in relative operating costs are one of many factors driving outcomes.
- Energy prices, product prices, production quantities, trade volumes are determined at the same time.
- We observe import and export flows but not global production.
- We do not observe domestic carbon price variation during our study period.

# Variation in energy costs over time



This figure summarizes variation in weighted average domestic energy prices, foreign natural gas prices, and foreign electricity prices over time.

# Coefficient estimates along energy intensity



This figure displays estimated elasticities calibrated to each industry along with 95 percent confidence intervals.



# Sensitivity analysis

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- Economic theory does not provide clear direction when specifying the particular forms of the relationships between determining factors and outcomes.
- To assess the robustness of our results, we estimate close to 600 specifications using the full sample of data covering 98 industries. **Robustness**
- The report summarizes the interquartile range of our estimates across the full suite of specifications.

# Carbon price impacts?

With some additional assumptions, we can use our elasticity estimates to 'simulate' the effect of a carbon price on domestic production, imports, exports.

- 1 Calculate the potential effect of a given carbon price (measured in \$ per metric ton  $CO_2$ ) on energy input costs using industry-specific carbon intensities.
- 2 Express this simulated energy price increase as a percent of industry-specific domestic energy costs.
- 3 Multiply by corresponding domestic production, import, and export elasticity estimates to assess potential impact of this carbon price on outcomes.

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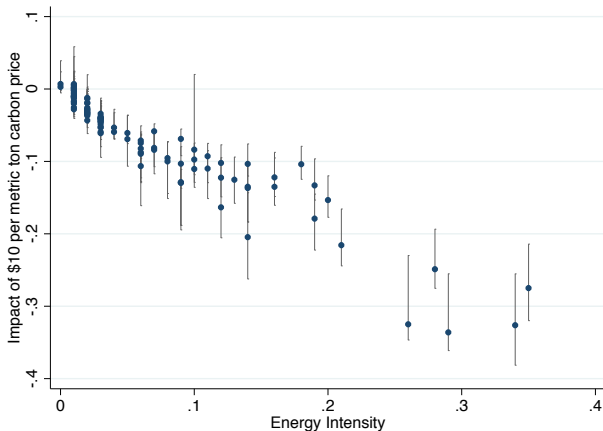
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# Estimated impact of \$10 per metric ton $CO_2$ price on domestic production values



Industries ordered according to energy intensity. Vertical axis measures percentage change in annual domestic production values. Bars show interquartile range across 192 specifications.

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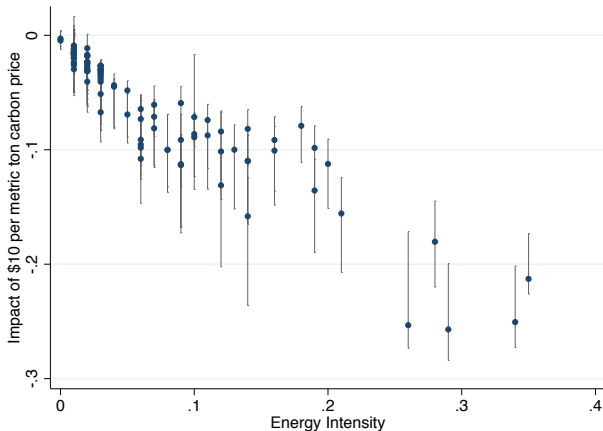
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# Estimated impact of \$10 per metric ton $CO_2$ price on exports



Industries ordered according to energy intensity. Vertical axis measures percentage change in annual export values. Bars show interquartile range across 192 specifications.

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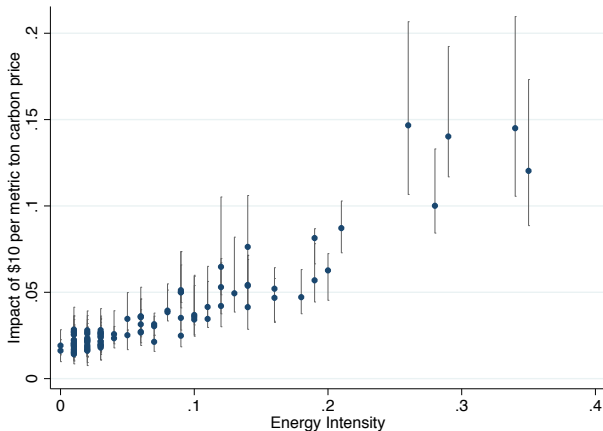
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# Estimated impact of \$10 per metric ton $CO_2$ price on imports



Industries ordered according to energy intensity. Vertical axis measures percentage change in annual export values. Bars show interquartile range across 192 specifications.

# Emissions leakage rates?

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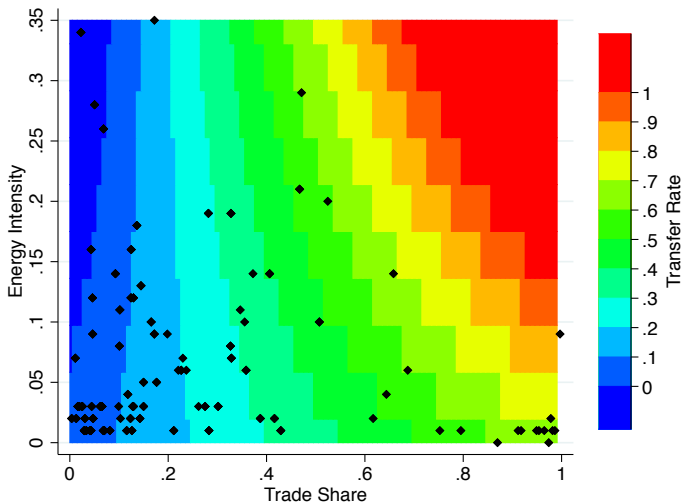
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- In principle, these elasticity estimates (together with estimates of baseline domestic production, import, and export volumes) can be used to calibrate industry-specific measures of market transfer rates.
- Market-transfer rates, in combination with estimates of the marginal emissions intensity of foreign production, can be used to calibrate output-based leakage rates:

$$\text{foreign emissions rate} \times \frac{\text{increase in imports} + \text{decrease in exports}}{\text{change in domestic production}}$$

- The report highlights several caveats and considerations; calibrated market-transfer rates should be interpreted with care.

# Heat map of market transfer rates



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# Market transfer rates in context

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- This calibration exercise generates an approximate upper bound on national rates of potential market transfer.
- On average, our upper bound estimate of market transfer rates fall below 20 percent for many industries.
- The product of the market-transfer rate and the corresponding foreign emissions rate would provide a theoretically consistent and empirically calibrated output-based measure of emissions leakage potential.
- An important caveat is that estimates are noisy and capture relatively short-run impacts.



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- Estimated elasticities capture the responsiveness of domestic production and trade flows to recent changes in relative energy costs.
- For the median industry, a 10 percent increase in domestic energy prices is associated with reductions in export values in the range of 3 to 9 percent and increases in import values in the range of 2 to 4 percent.
- Industries with higher energy intensities have systematically larger responses across all three outcome variables.

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- Estimates imply that a domestic carbon tax of \$10 per metric ton (and no output-based allocation updating) is associated with reductions in export values on the order of 6 percent or smaller for most industries.
- For cement, lime, industrial gas, wet corn milling, nitrogen fertilizer, iron and steel industries, we estimate negative impacts on export volumes of 20 percent or greater.
- Increases in imports estimated in the range of 4 percent or less for most industries; estimated impacts exceed 11 percent in cement, lime, and industrial gas industries.
- Estimated upper bound on market transfer rates fall at or below 20 percent for most industries.

# Caveats and conclusions

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- These results are most accurately interpreted in the context of a regulation that increases *domestic* energy costs on international import and export flows, respectively.
- Under the California Cap-and-Trade Program, our findings are most relevant for those industries in which California producers comprise a majority of exports (or California manufacturers demand the majority of imports of a manufacturing input).
- Two companion studies investigate intra-national, inter-state movements of production outputs and inputs.

# Estimation framework

The general form of the specifications we estimate:

$$\ln(y_{it}) = \alpha_0 + f(p_{it}^d, p_{it}^f, X_{it}; \beta) + \gamma \ln(w_{it}) + \phi_i + \eta_{st} + \varepsilon_{it},$$

where,

$i$  = 6-digit NAICS index,

$t$  = year index,

$y_{it}$  = aggregate outcome for industry  $i$  in year  $t$ ,

$p_{it}^d$  = domestic energy price,

$p_{it}^f$  = foreign energy price (a vector of foreign electricity and gas prices),

$X_{it}$  = Industry characteristics other than energy intensity (e.g., capital intensity)

$w_{it}$  = domestic wage,

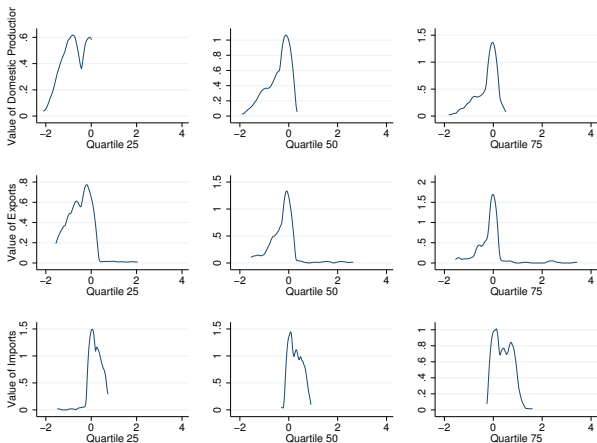
$\phi_i$  = 3-digit NAICS fixed effects,

$\eta_{st}$  = year by sector (2-digit NAICS) fixed effects.

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# Elasticity estimates across the full suite of specifications

Supplemental



This figure displays the density plots of the 25th, median, and 75th percentile estimates of elasticities across 192 different specifications. [Back to main2](#).