

The Aggregate Importance of Intermediate Input Substitutability

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Motivation

- ▶ Metals and Plastics used as intermediate inputs
- ▶ Increase in Metals sector TFP \Rightarrow decrease in price

Intermediate Input Substitutability	Intermediate Input Share Metals & Plastics	Size of Metals Sector	Aggregate TFP
Cobb-Douglas		—	↑




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Complements		↓	↑
Substitutes		↑	↑↑

This Paper

1. Estimate plant-level elasticities of substitution between inputs

- ▶ At 3 levels of aggregation:
 - ▶ 8 categories of materials (plastics, metals, ...)
 - ▶ Energy, materials and services
 - ▶ Capital-labor and intermediates
- ▶ Context: Indian manufacturing sector
 - ▶ Time horizon = 7 years
 - ▶ Trade liberalization \Rightarrow quasi-random changes in input prices

2. Embed estimates in a multi-sector GE model of Indian economy

- ▶ Assess importance of elasticities for:
 - ▶ Aggregate impact of sectoral TFP increases
 - ▶ Misallocation
 - ▶ Gains from trade

Main findings

- ▶ Empirical estimates: material inputs highly substitutable
 - ▶ **Material inputs (8 categories) are substitutes: 4.7**
 - ▶ Atalay (2017), Barrot & Sauvagnat (2016), Boehm, Flaaen & Pandalai-Nayar (2019): ≈ 0
 - ▶ This paper: permanent shock to prices, longer-run response
 - ▶ **Energy, materials and services are complements: 0.4**
 - ▶ Atalay (2017), Oberfield & Raval (2019): < 1
 - ▶ **Intermediate inputs and capital/labor are complements: 0.6**
 - ▶ Atalay (2017), Oberfield & Raval (2019): < 1
- ▶ Quantitative model: deviations from Cobb-Douglas important
 - ▶ **Gains from closing US-India TFP gap in one sector: 76% larger**
 - ▶ Baqaee & Farhi (2019)
 - ▶ **Losses from misallocation of inputs across plants: 6 times larger**
 - ▶ Baqaee & Farhi (2020), Oberfield & Boehm (2020)

Plant Production Function \Rightarrow Estimating Equation

- ▶ $Y_i = F_i(\text{Capital}_i, \text{Labor}_i, \underbrace{\text{Intermediates}_i}_{G_i(\text{Energy}_i, \text{Materials}_i, \text{Services}_i)})$

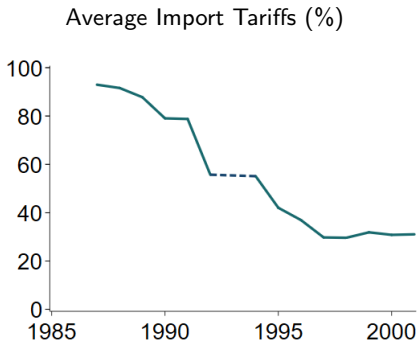
$$\text{Materials}_i = \left[\sum_{j=1}^J \pi_{ij} M_{ij}^{\frac{\theta-1}{\theta}} \right]^{\frac{\theta}{\theta-1}} \quad j = \text{Plastics, Metals, Chemicals, Woods, Minerals, Textiles, Agricultural, Other}$$

- ▶ Cost minimization \Rightarrow

$$\Delta \ln \left(\frac{P_{ij} M_{ij}}{P_{ik} M_{ik}} \right) = (1 - \theta) \Delta \ln \left(\frac{P_{ij}}{P_{ik}} \right) + \theta \Delta \ln \left(\frac{\pi_{ij}}{\pi_{ik}} \right)$$

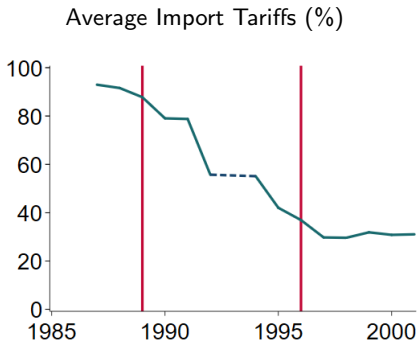
- ▶ Why not run OLS? **Simultaneity bias** and **attenuation bias**
 \Rightarrow use Δ import tariffs to instrument for Δ domestic input prices

Setting: India's Trade Liberalization (1991-1997)



- ▶ Policy 'experiment': IMF program after BoP crisis → **unanticipated**
- ▶ Large **permanent decline** in import tariffs (average = 50%)
- ▶ Tariff changes very **dispersed** (s.d. = 35%) and **quasi-random**
 - ▶ Uncorrelated with industry characteristics, etc.
 - ▶ Predicted by initial tariff levels (trade policy unchanged since 1950s)

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Estimation Strategy: Plant-level Elasticities

Survey of **formal Indian manufacturing plants** in 1989 and 1996 (ASI)

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Bartik approach \Rightarrow **plant-level prices and tariffs for Metals, ...**

- ▶ Wholesale price indices & tariffs for detailed input subcategories
- ▶ Weight using average plant shares (prices) or 1989 shares (tariffs)
- ▶ \Rightarrow variation in plant-level prices and tariffs

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Estimating Equations:

$$\text{First stage: } \Delta \ln(P_{ij}) = \rho \Delta \tau_{ij} + FE_i + FE_j + \eta_{ik}$$

$$\text{Second stage: } \Delta \ln \left(\frac{PM_{ij}}{PM_i} \right) = \beta \Delta \ln(P_{ij}) + FE_i + FE_j + \epsilon_{ik}$$

i = plant, j = material input category (e.g. Metals)

Estimates of elasticities of substitution

	θ		θ^X		ϵ	
	7 materials		E-M-S		KL-EMS	
	OLS	IV	OLS	IV	OLS	IV
	(1)	(2)	(3)	(4)	(5)	(6)
Elasticity	1.4	4.7				
	[1.0, 1.7]	[2.9, 6.5]				
Obs	14,294	14,294				
# plants	5,411	5,411				

First stage: for θ , the regression of price changes on tariff changes yields a coefficient of 0.09 (F-stat 56) for θ^X , a coefficient of 0.14 (F-stat 26); for ϵ , a coefficient of 0.11 (F-stat 23). Standard errors clustered at industry-level.

- ▶ First stage: regress % price changes on pp. tariff changes
 - ▶ Coefficient: 0.09 (F-stat: 56)

Estimates of elasticities of substitution

	θ		θ^X		ϵ	
	7 materials		E-M-S		KL-EMS	
	OLS	IV	OLS	IV	OLS	IV
	(1)	(2)	(3)	(4)	(5)	(6)
Elasticity	1.4	4.7	0.5	0.4		
	[1.0, 1.7]	[2.9, 6.5]	[0.1, 0.8]	[-0.3, 1.2]		
Obs	14,294	14,294	16,884	16,884		
# plants	5,411	5,411	8,616	8,616		

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Obs	14,294	14,294	16,884	16,884	8,449	8,449
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Heterogeneity & Robustness

Robustness: Estimates

- ▶ Non-importers
- ▶ Top 2 inputs / minimum spending shares
- ▶ Extensive margin
- ▶ Price and tariff construction

Heterogeneity:

- ▶ Individual industry estimates in line with pooled estimates Figure
- ▶ Slightly lower substitutability for small plants Estimates
- ▶ Preliminary: lower substitutability for shorter time horizons

Estimates of industry-level elasticities similar to plant-level

Quantitative Model

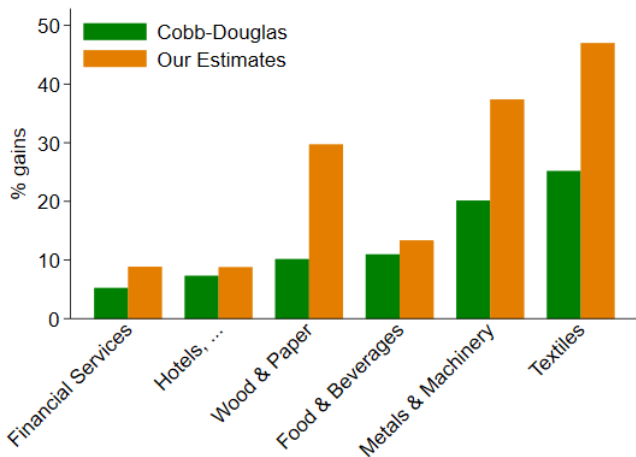
- ▶ Static open economy, multiple sectors, roundabout production
- ▶ Heterogeneous firms in each sector face CES demand
 - ▶ Production function has nested CES structure
 - ▶ Key elasticities of substitution: $\theta, \theta^X, \varepsilon$
 - ▶ Potentially face plant-specific input prices (distortions)
- ▶ Sectoral output used as intermediate or for final good production

Quantitative exercise: importance of $\theta \gg 1$ for

1. Aggregate effect of increasing one sector's TFP to the US level?
2. Aggregate losses due to input distortions?
3. (Paper: gains from trade liberalization & revenue distortions)

Gains from closing TFP gap to the US

- ▶ Gains are **76% larger** on average with an elasticity of 4.7.



- ▶ Similar amplification in model with cross-product substitution

Figure

Input Misallocation

- ▶ **Huge heterogeneity in factor shares** even within industry
 - ▶ Could be due to technology or plant-specific “distortions”
 - ▶ Transportation costs, markups charged by suppliers, taxes,...
- ▶ Distortions create **misallocation**
 - ▶ How large are losses from input distortions?
 - ▶ Role of substitutability between intermediate inputs?
- ▶ Conservative way to back out distortions
 - ▶ 1/3 of dispersion in factor shares from distortions
- ▶ Aggregate losses from adding input distortions?

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- ▶ Conservative way to back out distortions
 - ▶ 1/3 of dispersion in factor shares from distortions
- ▶ Aggregate losses from adding input distortions?
 - ▶ **36% of GDP with our estimates vs. 6% with Cobb-Douglas**

Conclusion

- ▶ Material inputs are **substitutable over the medium-run**
 - ▶ Elasticity of 4.7
 - ▶ More flexibility than existing short-run estimates
- ▶ Inputs more **complementary at higher levels of aggregation**
 - ▶ Energy, Materials and Services are complements
 - ▶ Intermediate input and capital/labor are complements
- ▶ Substitutability has **large effects on the macroeconomy**
 - ▶ Gains from raising TFP to US level $\approx 76\%$ larger
 - ▶ Losses from input misallocation ≈ 6 times larger

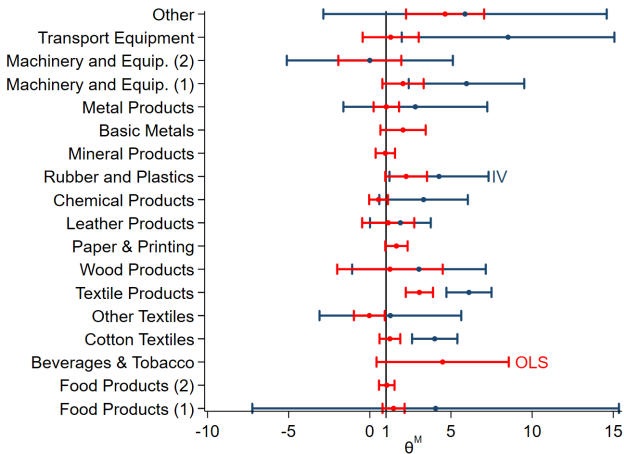
Robustness of θ estimate

	Top 2 Inputs		Non-importers		No Extensive Margin		Industry Prices and Tariffs	
	OLS (1)	IV (2)	OLS (3)	IV (4)	OLS (5)	IV (6)	OLS (7)	IV (8)
Elasticity	1.4 [1.0, 1.7]	3.6 [2.0, 5.2]	1.3 [1.0, 1.7]	4.4 [2.3, 6.5]	1.5 [1.0, 2.0]	4.6 [1.9, 7.4]	1.2 [0.9, 1.6]	3.5 [1.2, 5.9]
Δ tariffs		First Stage 0.091 (.014)		First Stage 0.084 (.013)		First Stage 0.078 (.011)		First Stage 0.100 (.022)
F-stat		44.2		40.1		44.7		17.7
Observations	10,822	10,860	10,932	10,932	4,386	4,386	14,294	14,294
# plants	5,430	5,430	4,148	4,148	1,562	1,562	5,411	5,411

Notes: Standard errors clustered at industry-level.

Back

θ heterogeneity across using industries

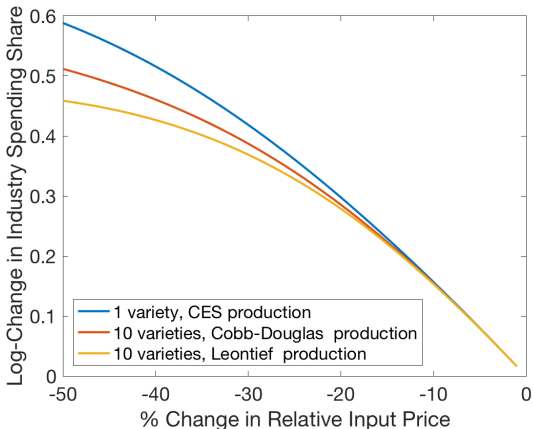


θ heterogeneity for small vs. large plants

	Below Median Size		Above Median Size	
	OLS (1)	IV (2)	OLS (3)	IV (4)
Elasticity	1.41 [1.0, 1.8]	3.57 [1.2, 5.9]	1.29 [0.9, 1.7]	5.85 [3.6, 7.1]
Observations	6,919	6,919	7,375	7,375
# plants	2,706	2,706	2,705	2,705

First stage: for plants below median size, the regression of price changes on tariff changes yields a coefficient of 0.09 (F-stat 37) for plants above median size, a coefficient of 0.08 (F-stat 48.4). Standard errors clustered at industry-level.

Substitution Between Products



- ▶ Large relative input price changes \Rightarrow similar predicted changes in industry spending shares \Rightarrow similar amplification [Back](#)