

Production Networks and Firm-level Elasticities of Substitution

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This Paper

- Being able to substitute across suppliers after shocks
 - Key for resilience of supply chains

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- Being able to substitute across suppliers after shocks
 - Key for resilience of supply chains
- **Provide one of the first causal estimates of firm-level elasticities of substitution across suppliers of the same product**
- Quantify importance of these elasticities in the propagation of shocks through firm networks

Paper in one slide

Data

- Real-time firm-to-firm transaction data for a large Indian state

Identification Strategy

- Supply shock: India's sudden lockdown policy due to Covid that made inputs costly to produce and transport for some producers

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Empirical results

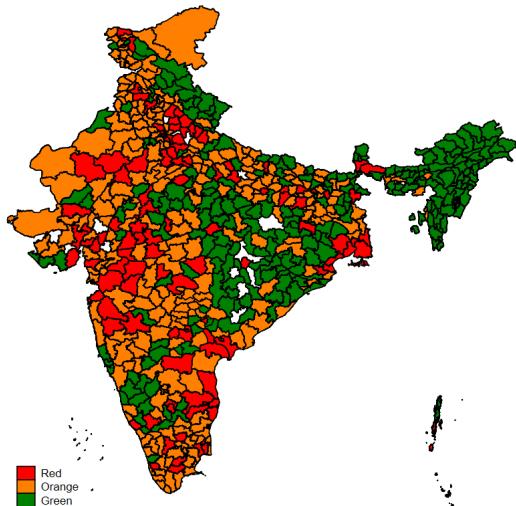
- Elasticities ≈ 0.52
- High levels of complementarity across suppliers

Model

- Extended production network model *a la* [Baqae and Farhi \(2019\)](#)

Lockdown in India

Lockdown Zones



Estimation of elasticity of substitution

- Estimating equation we take to the data:

$$\log \left(\frac{\widehat{PM}_{si,bj,t}}{\widehat{PM}_{i,bj,t}} \right) = (1 - \epsilon) \log \left(\frac{\widehat{p}_{si,bj,t}}{\widehat{p}_{i,bj,t}} \right) + \underbrace{\omega_{d(b),t}}_{\text{buyer destination shocks}} + \omega_{o(s)} + X\beta + \epsilon_{si,bj,t}$$

where $\widehat{x}_t = \frac{x_t}{x_{t-1}}$

Identification strategy

- Sources of variation:

$$\log(p_{si,bj,t}) = \log(\underbrace{p_{si,t}}_{\text{seller's MC}}) + \log(\underbrace{\tau_{sb,t}}_{\text{transport cost}})$$

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- Variation in $p_{si,t}$ (Seller-level instrument):

$$\begin{aligned} \log(\hat{p}_{si,bj,t}) &= \beta^R \text{Red}_{o(s)} \text{Lock}_t + \beta^O \text{Orange}_{o(s)} \text{Lock}_t \\ &+ \omega_{d(b),t} + \omega_{o(s)} + X\beta + \epsilon_{si,bj,t}^v \end{aligned}$$

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- Variation in $\tau_{sb,t}$ (Seller/buyer level instrument):

$$\begin{aligned} \log(\hat{p}_{si,bj,t}) &= \beta^R \text{Red}_{o(s)d(b)} \text{Lock}_t + \beta^O \text{Orange}_{o(s)d(b)} \text{Lock}_t \\ &\quad + \omega_{d(b),t} + \omega_{o(s)} + X\beta + \epsilon_{si,bj,t}^v \end{aligned}$$

Estimated elasticity of substitution across suppliers

	(1)	(2)	(3)
$\log\left(\frac{\hat{p}}{\bar{p}}\right)$	0.48 (0.22)	0.65 (0.15)	.17 (.01)
Obs	2426885	2426885	3611466
K-PF	20.31	12.58	-
J-stat	4.62	2.12	-
ϵ	0.52	0.35	.83
Seller/Buyer IV	Y		
Seller IV	Y	Y	
OLS			Y

Why does complementarity matter?

- When inputs are highly **complementary**: negative shocks to even a subset of firms can have large negative effects on the aggregate economy
- Lack of substitutability across suppliers can partially explain the fall in GDP in India during the Covid crisis

Conclusion

- We leverage **variation in input prices** following the Covid-19 lockdown
- Provide one of the first estimates of **elasticities of substitution across suppliers** within the same industry
- Embed these elasticities in extended production network model to quantify the role of complementarities

Thank You