

# Macro as Explicitly Aggregated Micro

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# The Aggregation Problem

- A program dating back to the very beginnings of economics.
- Derailed in 70s:
  - “negative” theoretical results (anything goes);
  - lack of disaggregated data.
- Recent explosion, building on pioneers of 80s and 90s.
- Increasing scope, scale, and availability of disaggregated data.
- Need flexible aggregation theories to harness deluge of data.

# Macro as Explicitly Aggregated Micro

- (HA) Distribution of heterogeneous agents.  
consumption and factor supplies
- (IO) Input-output network of heterogeneous producers.  
production from factors and intermediates
- Objective: develop a general approach to consistent theory and measurement of propagation and aggregation with HA+IO.
- Research agenda David Baqaee.

# Talk Based on Series of Papers with David Baqaee

- Inefficient economies.  
*“Productivity and Misallocation in General Equilibrium”*
- Nonlinearities in efficient economies.  
*“Macroeconomic Impact of Microeconomic Shocks: Beyond Hulten’s Theorem”*
- Economies with heterogeneous agents.  
*“Macroeconomics with Heterogeneous Agents and Input-Output Networks”*
- Intermediate-level aggregation.  
*“A Short Note on Aggregating Productivity”*
- Open economies.  
*“Networks, Barriers, and Trade”*
- Micro-foundations of aggregate production functions and the Cambridge-Cambridge Capital controversy.  
*“The Microeconomic Foundations of Aggregate Production Functions”*
- Ongoing work on increasing returns, entry/exit, dynamics, industry structure, growth, etc.

# First-Order Aggregation Theorems for Efficient Economies

- Solow (1957) with aggregate production function:

$$d \log Y = d \log TFP + \sum_f \Lambda_f d \log L_f.$$

- Hulten (1978) with HA+IO:

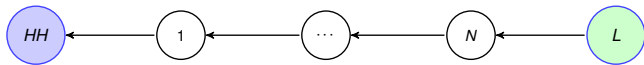
$$d \log TFP = \sum_k \lambda_k d \log A_k, \quad \text{where} \quad \lambda_k = \frac{\text{sales}_k}{GDP}.$$

- Structural foundation for Domar aggregation, not definition.
- Measurement (growth accounting); predictions (counterfactuals).
- Powerful irrelevance result: disaggregated details (IO network, factors, returns to scale, elasticities, wealth distribution and mpcs); initial level of aggregation.

# Limits of Hulten's Theorem and Need for New Theories

- Fails in inefficient economies.
- Fails at higher-orders of approx. relevant for nonlinearities.
- Disaggregated details and initial aggregation level matter.
- Need new theories for inefficient and nonlinear aggregation.

## Why Sales Shares? Ex. Simple Vertical Economy



- $k$  transforms  $k - 1$  linearly, productivity  $A_k$ .
- Zero value added for  $k \neq N$  but sales share  $\lambda_k = 1$ .
- Productivity shock to  $k$ :

$$\frac{d \log Y}{d \log A_k} = \lambda_k = 1.$$

- More complex economies with substitution and reallocation?

# Pure Technology Effects and Reallocation Effects

- Productivities  $A_i$  and allocation matrix  $\mathcal{X}_{ij} = x_{ij}/y_j$  give allocation.  
exogenous factor supplies (generalizes)
- Aggregate output function  $\mathcal{Y}(A, \mathcal{X})$ .  
via homothetic final demand aggregator or at constant prices
- Change in equilibrium aggregate output in response to shocks:

$$d \log Y = \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A}_{\text{pure technology}} + \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X}}_{\text{reallocation}}.$$



## Hulten's Theorem as an Envelope Theorem

$$d \log Y = \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A}_{\text{pure technology}} + \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X}}_{\text{reallocation}},$$

with

$$\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A = \lambda' d \log A \quad \text{and} \quad \frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X} = 0.$$

- Pure technology effects: Domar-weights sufficient stat.
- Zero reallocation effects despite reallocations (envelope).

# Distortions

- Capture arbitrary distortions with saturating wedges.
- Can represent wedges as markups  $\mu_i$  via network relabelling.
- Equilibrium aggregate output  $Y(A, \mu) = \mathcal{Y}(A, \mathcal{X}(A, \mu))$ .

## Two Reasons for Failure of Hulten with Distortions

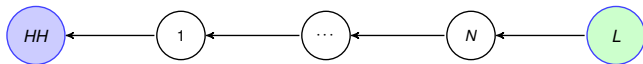
$$d \log Y = \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A}_{\text{pure technology}} + \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X}}_{\text{reallocation}},$$

with

$$\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A \neq \lambda' d \log A \quad \text{and} \quad \frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X} \neq 0.$$

- Two legs of Hulten's theorem break.
- Two key illustrating examples.

## Ex. Simple Vertical Economy



- $k$  transforms  $k - 1$  linearly, productivity  $A_k$ , markup/wedge  $\mu_k$ .
- Productivity shock to  $k$ .

## Ex. Simple Vertical Economy

$$\frac{d \log Y}{d \log A_k} = \underbrace{\frac{d \log \mathcal{Y}}{d \log A_k}}_{\text{pure technology}} + \underbrace{\frac{d \log \mathcal{Y}}{d \mathcal{X}} \frac{d \mathcal{X}}{d \log A_k}}_{\text{reallocation}}.$$

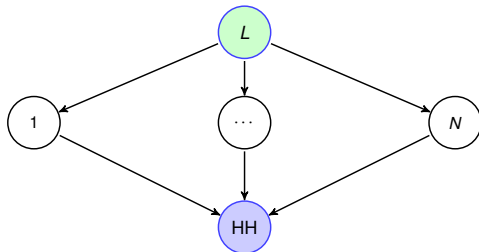
- Pure changes in technology:

$$\frac{d \log \mathcal{Y}}{d \log A_k} = \tilde{\lambda}_k = 1 \neq \lambda_k = \prod_{i=1}^{k-1} \mu_i^{-1}.$$

- Reallocation effects:

$$\frac{d \log \mathcal{Y}}{d \mathcal{X}} \frac{d \mathcal{X}}{d \log A_k} = 0.$$

## Ex. Simple Horizontal Economy



- $k$  produces from labor, productivity  $A_k$ , markup/wedge  $\mu_k$ .
- CES consumption aggregator with elasticity  $\theta_0$ .
- Allocation matrix  $\mathcal{X}(A, \mu) = \left( \frac{L_1(A, \mu)}{L}, \dots, \frac{L_N(A, \mu)}{L} \right)$ .
- Productivity shock to  $k$ .

## Ex. Simple Horizontal Economy

$$\frac{d \log Y}{d \log A_k} = \underbrace{\frac{d \log \mathcal{Y}}{d \log A_k}}_{\text{pure technology}} + \underbrace{\frac{d \log \mathcal{Y}}{d \mathcal{X}} \frac{d \mathcal{X}}{d \log A_k}}_{\text{reallocation}}.$$

- Pure changes in technology:

$$\frac{d \log \mathcal{Y}}{d \log A_k} = \lambda_k.$$

- Reallocation effects as changes in allocative efficiency:

$$\frac{d \log \mathcal{Y}}{d \mathcal{X}} \frac{d \mathcal{X}}{d \log A_k} = -\frac{d \log \Lambda_L}{d \log A_k} = -(\theta_0 - 1) \left( \frac{\mu_k^{-1}}{\sum_j \lambda_j \mu_j^{-1}} - 1 \right) \lambda_k.$$

## HA+IO concepts

- Revenue-based and cost-based input-output matrix:

$$\Omega_{ij} = \frac{p_j x_{ij}}{p_i y_i}, \quad \tilde{\Omega}_{ij} = \frac{p_j x_{ij}}{\sum_{j'} p_{j'} x_{ij'}}.$$

- Revenue-based and cost-based Leontief inverse matrix:

$$\Psi = (I - \Omega)^{-1} = I + \Omega + \Omega^2 + \dots, \quad \tilde{\Psi} = (I - \tilde{\Omega})^{-1} = I + \tilde{\Omega} + \tilde{\Omega}^2 + \dots$$

- Revenue-based and cost-based Domar weights:

$$\lambda = b' \Psi, \quad \tilde{\lambda} = b' \tilde{\Psi}.$$

- Revenue-based and cost-based factor shares  $\Lambda$  and  $\tilde{\Lambda}$ .



## Aggregation with Distortions

$$d \log Y = \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A}_{\text{pure technology}} + \underbrace{\frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X}}_{\text{reallocation}}$$

with

$$\frac{\partial \log \mathcal{Y}}{\partial \log A} d \log A = \tilde{\lambda}' d \log A \quad \text{and} \quad \frac{\partial \log \mathcal{Y}}{\partial \mathcal{X}} d \mathcal{X} = -\tilde{\lambda}' d \log \mu - \tilde{\Lambda}' d \log \Lambda.$$

- Pure technology: cost-based Domar weights sufficient stat.
- Reallocation: changes in factor shares sufficient stat.
- Disaggregated details and initial aggregation level matter.

# Propagation Equations

- Propagation equations:

$$\frac{d \log \lambda_i}{d \log A_k} = \sum_j \mu_j^{-1} \lambda_j (\theta_j - 1) \text{Cov}_{\tilde{\Omega}^{(i)}} \left( \tilde{\Psi}_{(k)}, \frac{\Psi^{(i)}}{\lambda_i} \right).$$

- Can also derive equations for prices and quantities.
- IO network and elasticities sufficient stat.
- Can be extended and applied with endogenous wedges.

## Growth Accounting

- Change in aggregate TFP as new “distorted” Solow residual:

$$d \log TFP = d \log Y - \tilde{\Lambda}' d \log L.$$

- Decomposition of changes in aggregate TFP:

$$d \log TFP = \underbrace{\tilde{\lambda}' d \log A}_{\text{pure technology}} \underbrace{- \tilde{\lambda}' d \log \mu - \tilde{\Lambda}' d \log \Lambda}_{\text{allocative efficiency}}.$$

- Can perform decomposition without imposing *any* parametric assumptions on production functions.
- Generalizes Hall (88,90) for disaggregated economies.

## Alternative Decompositions: Statistical

- Popular decompositions: Baily et al. (92), Giriliches-Regev (95), Olley-Pakes (96), Foster et al. (01).
- Decompositions of change in ad-hoc aggregate TFP index.
- Not decompositions of change aggregate TFP.
- Ex. Baily et al. (92):

$$d \log \left( \sum_i \lambda_i A_i \right) = \sum_i \lambda_i d \log A_i + \sum_i A_i d \log \lambda_i,$$

## Alternative Decompositions: Economic

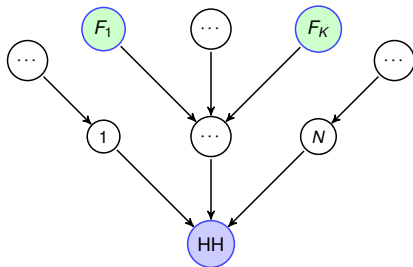
- Popular decompositions: Jorgenson et al. (1987), Basu-Fernald (2002), and Petrin-Levinsohn (2012).
- Ad-hoc decompositions of change in aggregate TFP.
- “Grouping of terms”, not GE couterfactuals.
- Ex. Jorgenson et al. (1987):

$$d \log TFP = \sum_i \lambda_i d \log A_i + \left( d \log TFP - \sum_i \lambda_i d \log A_i \right).$$

## Alternative Decompositions: Misleading

- Detect reallocation effects when they unambiguously shouldn't:
  - efficient economies;
  - economies without reallocation.
  
- See also Osotimehin (19).

## Revealing Example of Acyclic Economies



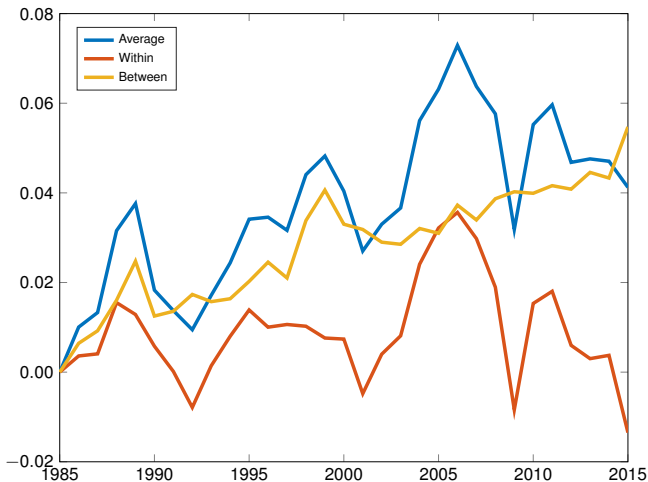
- Unique feasible allocation, hence efficient.
- No reallocation effects, no changes in allocative efficiency.
- Alternative decompositions fail.

## Application: Markups in US

- Suppose markups are only distortions.
- Use annual IO tables from BEA from 1997-2015.
- Assign Compustat firms to industries.
- Use firm-level markups from three approaches: user cost, production function, and accounting profits.
- Aggregate-up from firm level.

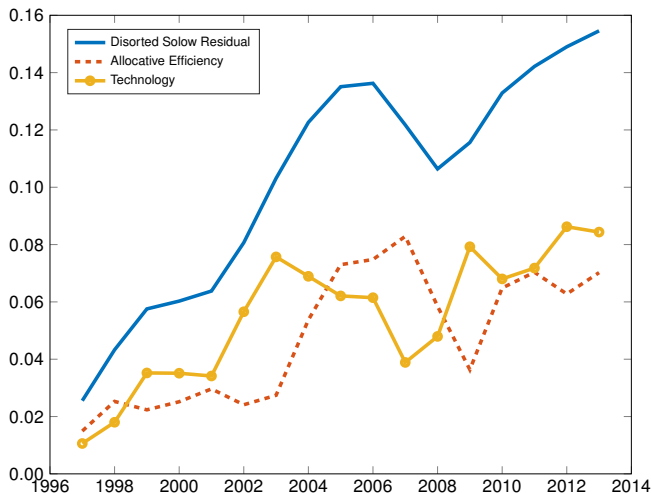


## (Harmonic) Average Markups: Between and Within



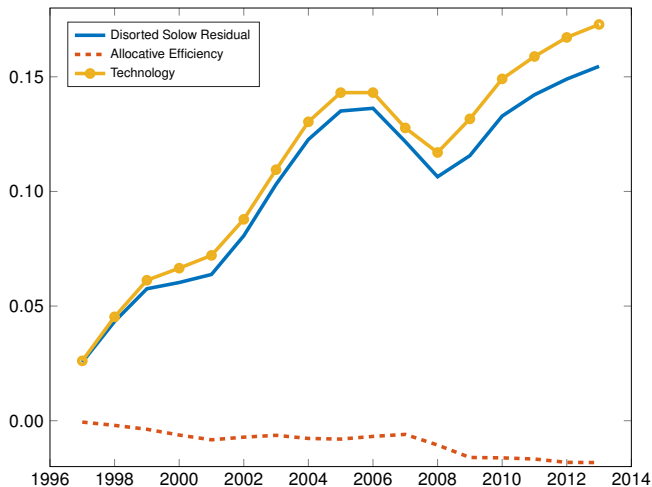
- With user-cost-approach markup data.
- Similar with other approaches for markups.

## Sources of Growth



- With user-cost-approach markup data.
- Similar with other approaches for markups.

## Sources of Growth: Industry Level Instead of Firm Level



- With user-cost-approach markup data.
- Similar with other approaches for markups.
- Illustrates importance of disaggregation.

## Distance to the Frontier

- Different notion of change in allocative efficiency.
- Second-order approx. of distance to frontier for small wedges.
- Sum of Harberger triangles in GE:  
~Harberger (64) but aggregate TFP (not welfare) without implausible transfers

$$\mathcal{L} \approx - \sum_j \frac{1}{2} \lambda_j \Delta \log \mu_j \Delta \log y_j.$$

- Structural formula:

$$\mathcal{L} \approx \sum_j \frac{1}{2} \lambda_j \theta_j \text{Var}_{\Omega^{(j)}} \left( \sum_k \Psi_{(k)} \Delta \log \mu_k \right).$$

- Role of elasticities, IO network, distribution of wedges.

## Application: Gains from Eliminating Markups in US

- Calibrate parametric model.
- Use IO table from BEA from 2015.
- Benchmark elasticities of substitution: across industries in consumption 0.9; between value-added and intermediates 0.5; across intermediates in production 0.01; between labor and capital 1; within industries 8.

## Gains from Eliminating Markups in US

	User Cost (UC)	Accounting (AP)	Production Function (PF)
2015	20%	17%	24%
1997	3%	5%	17%

- Measures show big increase between 1997 and 2014.
- Contrast with 0.1% estimate of Harberger (1954) triangles.

*“It takes a heap of Harberger triangles to fill an Okun gap.”*

— Tobin

## Gains from Eliminating Markups: Robustness

	Benchmark	CD + CES	$CES = 4$	No IO	Sectoral
UC	20%	21%	10 %	7 %	0.7%
AP	17%	18%	9 %	7 %	1%
PF	24 %	27 %	13%	13%	3%

- Elasticities matter.
- Input-output structure matters.
- Illustrates importance of disaggregation.

## Nonlinearities

$$d^2 \log Y = d \log A' \frac{\partial^2 \log \mathcal{Y}}{\partial \log A^2} d \log A + d \log A' \frac{\partial^2 \log \mathcal{Y}}{\partial \log A d \mathcal{X}} d \mathcal{X},$$

$$= d \lambda' d \log A \quad \text{with } d \lambda \text{ from propagation equations.}$$

- Second-order approx. (with  $\Delta \lambda$  from propagation equations):

$$\Delta \log Y \approx \lambda' \Delta \log A + \frac{1}{2} \Delta \lambda' \Delta \log A.$$

- Changes in sales shares ex-post sufficient stat.
- IO network and elasticities ex-ante sufficient stat.
- Disaggregated details and initial aggregation level matter.



## Back to Horizontal Economy

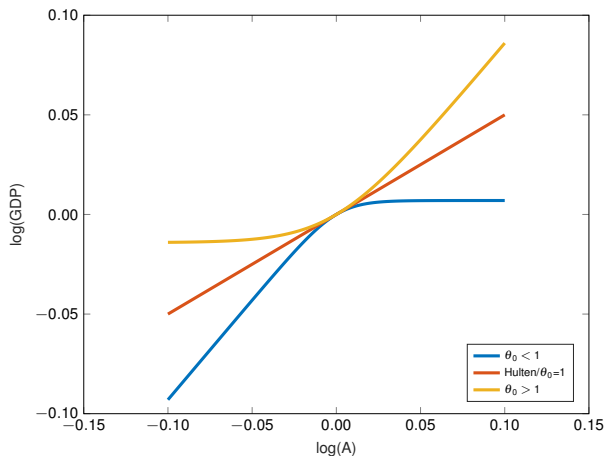
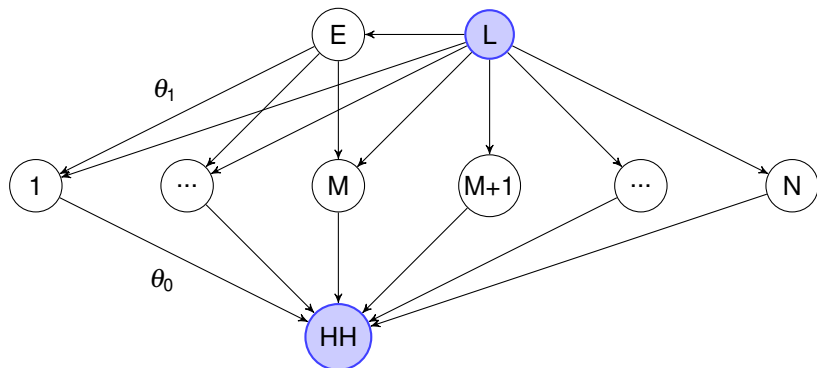


Figure: Aggregate output as a function of shocks to one of the producers.

- Cobb-Douglas knife-edge case with no nonlinearities.
- Implications for firm- vs. sector-level shocks.

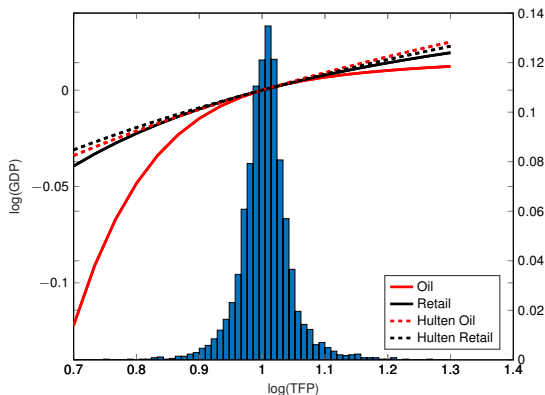
## “Universal” Input Example

One factor, full reallocation, two elasticities  $\theta_1 \ll \theta_0$ .



$$\frac{d^2 \log C}{d \log A_E^2} = \frac{d \lambda_E}{d \log A_E} = (\theta_0 - 1) \lambda_E \left( \frac{N}{M} - 1 \right) \lambda_E + (\theta_1 - 1) \lambda_E \left( 1 - \frac{N}{M} \lambda_E \right).$$

## Oil v. Retail



- Simulated model, no markups, sectoral-level shocks.
- Intuition: low micro-elasticity of substitution, universal input.
- Large asymmetric effects of oil shocks (Hamilton, 2003).

## Reduced-form Impact of Oil Shocks

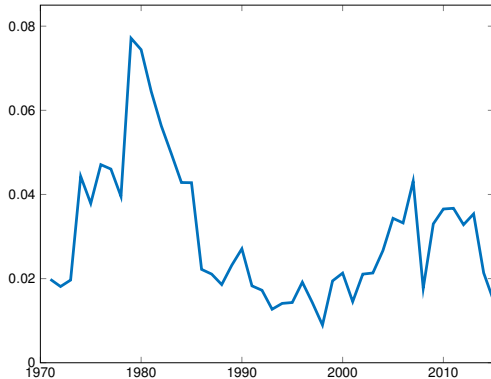


Figure: Global expenditures on crude oil as a fraction of world GDP.

- First-order effect:  $1.8\% \times -13\% \approx -0.2\%$ .
- Second-order effect:  $\frac{1}{2}(1.8\% + 7.6\%) \times -13\% \approx -0.6\%$ .

## Baumol's Cost Disease and US TFP Growth

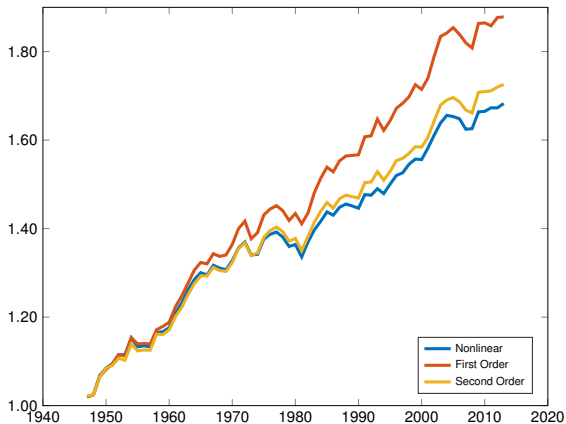


Figure: Cumulative change in  $TFP$ : nonlinear (actual), first-order approximation, and second-order approximation.

- Baumol's cost disease reduced aggregate TFP growth by 20 pp.

## Application: Gains from Trade in Trade Models

$(\sigma, \zeta, \theta)$	No IO (1, 1, 1)	(1, 1, 1)	(1, 0.5, 0.6)	(0.9, 0.5, 0.2)
FRA	9.8%	18.5%	24.7%	30.2%
JPN	2.4%	5.2%	5.5%	5.7%
MEX	11.5%	16.2%	21.3%	44.5%
USA	4.5%	9.1%	10.3%	13.0%

- Accounting for IO network and cross-industry elasticities drastically magnifies gains from trade.
- Shortcuts with no IO fine qualitatively but not quantitatively.
- Illustrates importance of disaggregation.

# Conclusion

- Macro as explicitly aggregated micro increasingly possible.
- More and better disaggregated data.
- New theories of propagation and aggregation with HA+IO.
- Explosion of work, much more needed (theory, data, empirics).