

# Nonlinearities in Disaggregated Economies with Implications for the Covid-19 Crisis

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## The Question We Ask

- Covid-19 unusual aggregate shock.
- Messy mix of big heterogenous supply and demand shocks.
- Nonlinearities (amplification and interactions)?

## How We Try to Answer the Question

- Study output, unemployment, inflation.
- Use general disaggregated model and aggregate up.
- Allow for neoclassical and Keynesian channels.
- Find quantitatively large nonlinearities from both channels.
- Explain where they come from.
- Explain why they matter.

# Agenda

## Neoclassical Nonlinearities

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## Keynesian Nonlinearities

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# Model Structure

- $\mathcal{N}$  produced goods.
- $\mathcal{G}$  factors in inelastic supply.
- Homothetic final demand (can generalize).
- Goods produced using other goods and factors.

# Final Demand

- Final demand maximizes homothetic aggregator:

$$\mathcal{D}(c_1, \dots, c_{\mathcal{N}}; \omega_{\mathcal{D}}),$$

with  $c_i$  final consumption of good  $i$ ,  $\omega_{\mathcal{D}}$  demand shifter.

- Budget constraint:

$$\sum_{i \in \mathcal{N}} p_i c_i = \sum_{f \in \mathcal{G}} p_f L_f + \sum_{i \in \mathcal{N}} \pi_i,$$

with  $p_i$  prices,  $p_f$  wages,  $L_f$  factors,  $\pi_i$  profits.

## Producers and Factors

- Good  $i$  produced under constant returns:

$$y_i = A_i F_i(x_{i1}, \dots, x_{i\mathcal{N}}, L_{i1}, \dots, L_{i\mathcal{G}}),$$

with  $y_i$  output,  $x_{ij}$  input  $j$ ,  $L_{if}$  factor  $f$ ,  $A_i$  total factor productivity.

- Producer  $i$  maximizes profits:

$$\pi_i = \max_{\{y_i\}, \{x_{ij}\}, \{L_{if}\}} p_i y_i - \sum_{j \in \mathcal{N}} p_j x_{ij} - \sum_{f \in \mathcal{G}} p_f L_{if}.$$

- Inelastic factor supplies  $L_f$ .



# Equilibrium

- Agents optimize.
- Markets clear.

# Comparative Statics

- Perturb initial equilibrium with shocks.
- Supply shocks:  $A_i, L_f$ .
- Demand shocks:  $\omega_{\mathcal{D}}$ .
- Preference-driven or policy-induced.
- Could also be equilibrium outcomes in richer model.

## Generality

- Captures factor augmenting productivity shocks with relabeling.
- Captures variable returns with fixed quasi-factors.
- Can be applied within a period or intertemporally.

# Input-Output Definitions

- Final demand as producer 0, factors as endowment producers.
- Input-output matrix:

$$\Omega_{ij} \equiv \frac{p_j x_{ij}}{p_i y_i} = \frac{p_j x_{ij}}{\sum_{k \in \mathcal{N} + \mathcal{G}} p_k x_{ik}}.$$

- Leontief inverse matrix:

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

- Nominal GDP:

$$GDP \equiv \sum_{i \in \mathcal{N}} p_i x_{0i}.$$

- Sales shares:

$$\lambda_i \equiv \frac{p_i y_i}{GDP} = \Psi_{0i}.$$

## Real GDP (Output) Definition

- Define changes in real GDP  $\Delta \log Y$  as in data.
- Deflate changes in nominal GDP by changes in GDP deflator.
- With demand shocks (see paper): exotic path-dependence properties and divergence from welfare.

## Nested CES Economies

- General nested-CES economy (can generalize).
- Relabel network so that each node corresponds to one CES nest.
- Demand share-shifter  $\omega_0$  in final demand nest 0.

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# Aggregation Equation

- Changes in output are approximated by (second order):

$$\Delta \log Y \approx \underbrace{\sum_{k \in \mathcal{N}} \lambda_k \Delta \log A_k + \sum_{f \in \mathcal{G}} \lambda_f \Delta \log L_f}_{\text{first order: Hulten}} + \underbrace{\frac{1}{2} \sum_{k \in \mathcal{N}} \lambda_k \Delta \log \lambda_k \Delta \log A_k + \frac{1}{2} \sum_{f \in \mathcal{G}} \lambda_f \Delta \log \lambda_f \Delta \log L_f}_{\text{second order: nonlinearities}}.$$

- First order (Hulten's theorem): initial shares.
- Second order (nonlinearities): equilibrium changes in shares.
- Demand shocks: no independent impact; matter only via interactions with supply shocks.
- Network and elasticities matter via changes in shares (suff. stat.).



# Propagation Equations

- Changes in shares are approximated by (first order):

$$\begin{aligned}\lambda_i \Delta \log \lambda_i &\approx \theta_0 \text{Cov}_{\Omega^{(0)}} \left( \Delta \log \omega_0, \Psi_{(i)} \right) \\ &+ \sum_{j \in 1+\mathcal{N}} \lambda_j (\theta_j - 1) \text{Cov}_{\Omega^{(j)}} \left( \sum_{k \in \mathcal{N}} \Psi_{(k)} \Delta \log A_k \right. \\ &\quad \left. + \sum_{g \in \mathcal{G}} \Psi_{(g)} (\Delta \log \lambda_g - \Delta \log L_g), \Psi_{(i)} \right).\end{aligned}$$

- Network and elasticities suff. stat.

## Cobb-Douglas ( $\theta_j = 1$ )

- Changes in output are approximated by (second order):

$$\Delta \log Y \approx \underbrace{\sum_{k \in \mathcal{N}} \lambda_k \Delta \log A_k + \sum_{f \in \mathcal{G}} \lambda_f \Delta \log L_f}_{\text{first order: Hulten}} + \underbrace{\frac{1}{2} \text{Cov}_{\Omega(0)} \left( \Delta \log \omega_0, \sum_{k \in \mathcal{N}} \Psi_{(k)} \Delta \log A_k + \sum_{f \in \mathcal{G}} \Psi_{(f)} \Delta \log L_f \right)}_{\text{second order: demand shocks} \times \text{supply shocks}}.$$

- Amplification or mitigation.
- Key role of network in propagating demand shocks.

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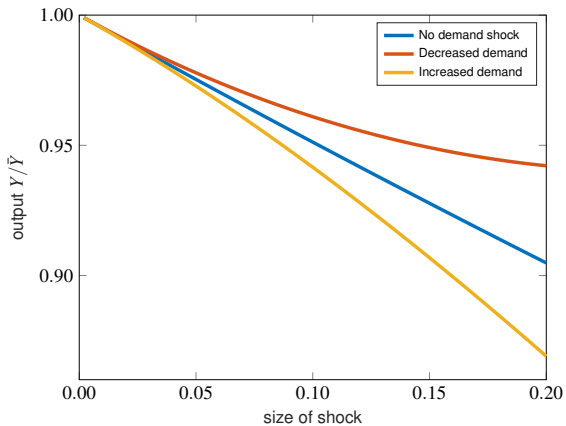
# Concrete Examples

- Amplification of negative supply shocks:
  - Amazon's forced warehouse closure in France while consumers shift demand towards Amazon;
  - meat-packing plants (Smithfield, JBS) in U.S. while consumers shift demand towards meat.
- Mitigation of negative supply shocks:
  - restaurant closures while consumers shift demand away from restaurants;
  - cinema closures while consumers shift demand away from cinemas.

## Numerical Illustration

- Two sectors of same size.
- Each sector produce with a labor.
- Labor reduction in one sector.
- Compare scenario without simultaneous demand shocks and scenarios with simultaneous demand shocks towards or away from affected sector.

# Interaction of Supply and Demand Shocks



## Uniform Elasticities ( $\theta_j = \theta$ ) and Labor-Supplied Shocks

- ‘As if’ CES aggregate production function:

$$\frac{Y}{\bar{Y}} = \left( \sum_{f \in \mathcal{G}} \bar{\lambda}_f \left( \frac{L_f}{\bar{L}_f} \right)^{\frac{\theta-1}{\theta}} \right)^{\frac{\theta}{\theta-1}} .$$

- Irrelevance of the network!
- Conditions for network relevance (see paper for examples): non-uniform elasticities, demand shocks, TFP shocks.

## Uniform Elasticities ( $\theta_j = \theta$ ) and Labor-Supplied Shocks

- Changes in output are approximated by (second order):

$$\Delta \log Y \approx \underbrace{\sum_{f \in \mathcal{G}} \lambda_f \Delta \log L_f}_{\text{first order: Hulten}} + \underbrace{\frac{1}{2} \frac{\theta - 1}{\theta} \text{Var}_\lambda (\Delta \log L)}_{\text{second order: nonlinearities}}.$$

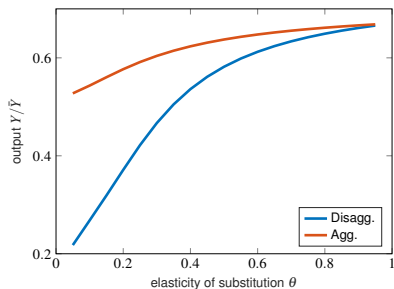
- Amplify negative shocks with complementarities  $\times$  heterogeneity.



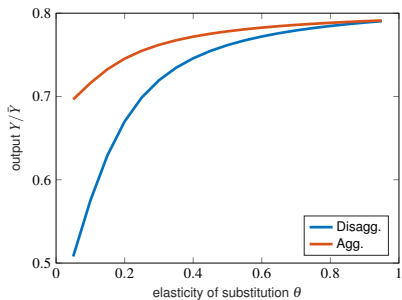
## Numerical Illustration

- Stylized version of U.S. economy: 66 sectors, sectoral production using capital, labor, and intermediates.
- Factors cannot be reallocated across sectors (short run).
- Uniform elasticities ( $\theta_j = \theta$ ).
- Labor-supplied shocks: in each sector, remove fraction  $x$  of workers in jobs that cannot be done from home (built from Mongey et al. (2020) and Dingel and Neiman (2020)).
- Compare to CES aggregate production function with same elasticity  $\theta$ , and single labor and capital aggregates.

# More Amplification with Heterogenous Shocks



(a) more extreme scenario  $x = 1$



(b) less extreme scenario  $x = 0.7$

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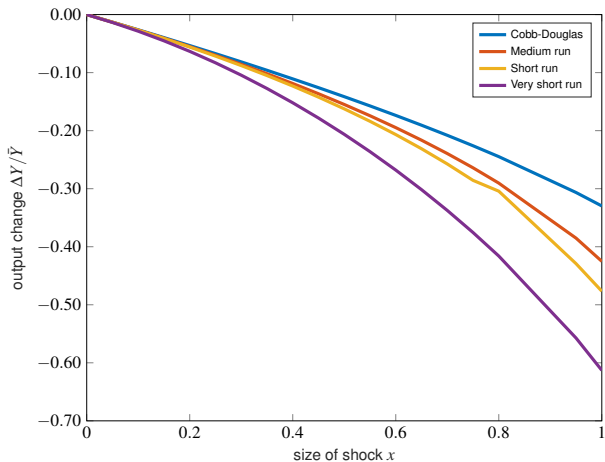
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## Quantitative Illustration

- Same 66-sector input-output model as before.
- Elasticities: between labor and capital ( $\eta$ ), between intermediates ( $\theta$ ), between value-added and intermediates ( $\varepsilon$ ), and between final consumptions in final demand ( $\sigma$ ).
- Three calibrations inspired by estimates in literature:
  - $(\sigma, \theta, \varepsilon, \eta) = (0.7, 0.1, 0.1, 0.1)$  for very short run;
  - $(\sigma, \theta, \varepsilon, \eta) = (0.7, 0.1, 0.3, 0.5)$  for short run;
  - $(\sigma, \theta, \varepsilon, \eta) = (0.95, 0.1, 0.5, 0.5)$  for medium run.
- Same labor-supply shock: fraction  $x$  of "can't work from home" removed from workforce.

# Amplification from Nonlinearities



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## More in Paper

- Elastic factor supplies.
- Reallocation.
- Welfare.

## Keynesian Nonlinearities

- So far, second-order neoclassical nonlinearities.
- Now, first-order Keynesian nonlinearities from nominal “kinks”:
  - downward nominal wage rigidity;
  - ZLB constraint on nominal interest rate.



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## Keynesian Model

- Two periods: present and future.
- Utility maximization s.t. intertemporal budget constraint.
- Present: same as before + downward nominal wage rigidity.
- Future: full employment + fixed nominal expenditure.
- Monetary policy: full employment s.t. ZLB.

## Euler Equation for Intertemporal Problem

- Log-linearized Euler equation:

$$d\log Y = -\rho d\log p^Y + d\log \zeta.$$

- Aggregate demand (AD) shock:

$$d\log \zeta = -\rho (d\log(1+i) + d\log \beta - d\log \bar{p}_*^Y) + d\log \bar{Y}_*.$$

- No AD shock  $\implies$  stagflation (recession and inflation).

## Euler equation for Nominal Expenditure $E = p^Y Y$

- Euler equation for nominal expenditure:

$$d\log E = (1 - \rho)d\log p^Y + d\log \zeta.$$

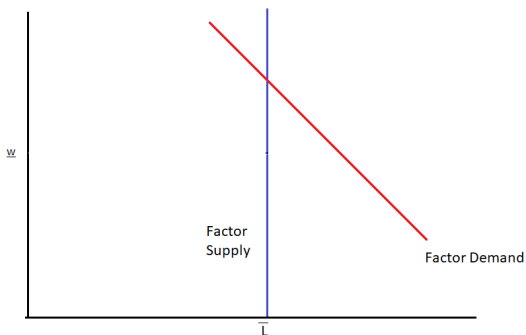
- Focus on  $\rho = 1$  nominal expenditure exogenous:

$$d\log E = d\log \zeta.$$

# Factor Supply and Factor Demand

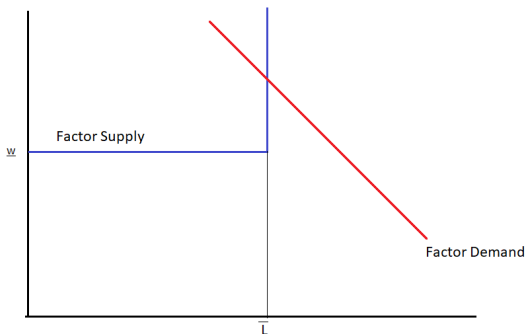
- Different types of factors.
- Always-flexible  $f \in \mathcal{K}$  (“capitals”) with vertical supply curves.
- Potentially-rigid  $f \in \mathcal{L}$  (“labors”) with L-shaped supply curves:
  - flexible in equilibrium  $f \in \mathcal{F}$ ;
  - rigid in equilibrium  $f \in \mathcal{R}$ .

## Supply and Demand for “Capitals”



- Shocks to supply  $d \log \bar{L}_f$  and nominal demand  $d \log \lambda_f + d \log E$ .
- Flexible wage adjustment  $d \log w_f$ .
- Factor supplied  $d \log L_f = d \log \bar{L}_f$ .

## Supply and Demand for “Labors”



- Shocks to supply  $d \log \bar{L}_f$  and nominal demand  $d \log \lambda_f + d \log E$ .
- Constrained wage adjustment  $d \log w_f \geq 0$ .
- Factor supplied  $d \log L_f = \min \{ d \log \lambda_f + d \log E, d \log \bar{L}_f \}$ .

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# Propagation and Aggregation Equations

- Beware of multiple equilibria!
- Nonlinear determination of rigid-factor set  $\mathcal{R}$ .
- Linear derivative given set of rigid factors  $\mathcal{R}$ :
  - same propagation and aggregation equations;
  - apply with  $d \log L_f$  from factor-supplied equations.

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## Cobb-Douglas ( $\theta_j = 1$ )

- Changes in output

$$d \log Y = \underbrace{\sum_{i \in \mathcal{N}} \lambda_i d \log A_i + \sum_{f \in \mathcal{G}} \lambda_f d \log \bar{L}_f}_{\text{Neoclassical effect}} + \underbrace{\sum_{f \in \mathcal{L}} \lambda_f \min \left\{ \text{Cov}_{\Omega(0)} \left( d \log \omega_0, \frac{\Psi^{(f)}}{\lambda_f} \right) + d \log \zeta - d \log \bar{L}_f, 0 \right\}}_{\text{Keynesian amplification}}.$$

- First-order Keynesian nonlinearities amplify output reductions.
- Keynesian unemployment if demand shifts away from a factor.
- Network key for propagation of shocks to composition of demand.

## Uniform Elasticities ( $\theta_j = \theta$ ) and Labor-Supply Shocks

- Network irrelevance once again!
- With substitutes ( $\theta > 1$ ):
  - reduction in labor supplied *increases* demand for other labors;
  - no Keynesian unemployment;
  - unique equilibrium.
- With complements ( $\theta < 1$ ):
  - reduction in labor supplied *reduces* demand for other labors;
  - Keynesian unemployment (factors with smallest supply shocks);
  - possibility of multiple equilibria.
- Generalizes to also include AD shocks.

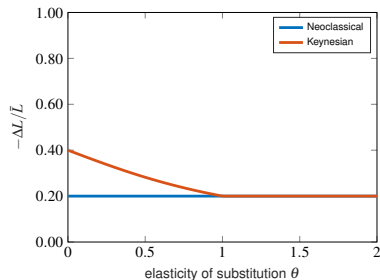
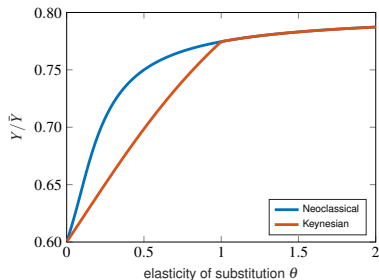
## Uniform Complementarities ( $\theta_j = \theta < 1$ )

- Global comparative statics ( $\Delta$  instead of  $d$ ).
- Set of equilibrium vectors  $\Delta \log L$  with partial ordering  $\leq$  is *lattice*.
- Unique best and worst equilibrium.
- $\Delta \log Y$  and  $\Delta \log L$  increasing in  $\Delta \log \bar{L}$  and  $\Delta \log \zeta$ .
- Key: reduction in labor supplied *reduces* demand for other labors.

## Numerical Illustration

- Uniform elasticity  $\theta$ .
- Two labor markets of equal size.
- Reduction of 40% in labor supply of one of the labors.
- Compare Keynesian economy with downward nominal rigidity to neoclassical economy with flexible wages.

# Keynesian vs. Neoclassical



- Keynesian unemployment decreases with elasticity  $\theta$ .
- Keynesian output amplification hump-shaped in elasticity  $\theta$ .

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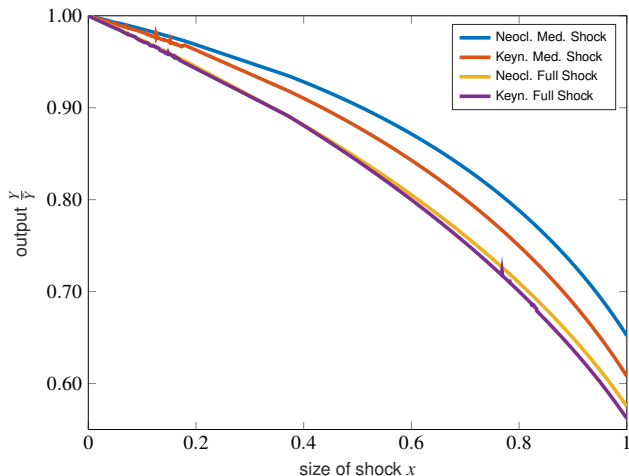
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## Quantitative Illustration

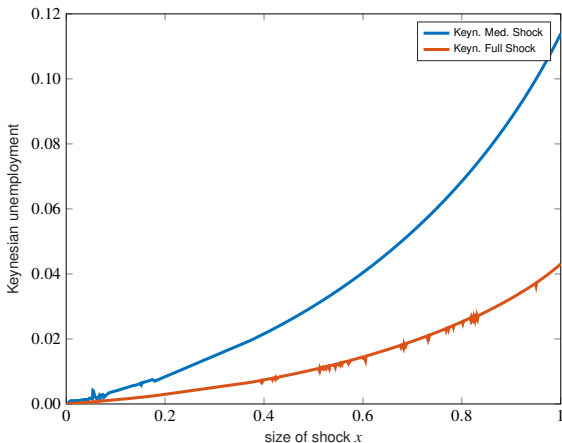
- Same 66-sector in-out model as before.
- Use higher elasticities  $(\sigma, \theta, \varepsilon, \eta) = (0.95, 0.1, 0.5, 0.5)$ .
- Same labor-supply shock: fraction  $x$  of "can't work from home" removed from workforce.
- Also consider only shock to sectors with below-median ability to work from home (more heterogeneous, milder).
- Compare neoclassical and Keynesian economies

# Keynesian Output Amplification



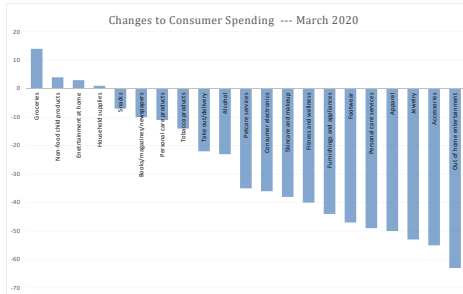
- More Keynesian output amplification with more heterogeneous shock even though milder shock.

# Keynesian Unemployment



- More Keynesian unemployment with more heterogenous shock even though milder shock.

# Negative AD shock?

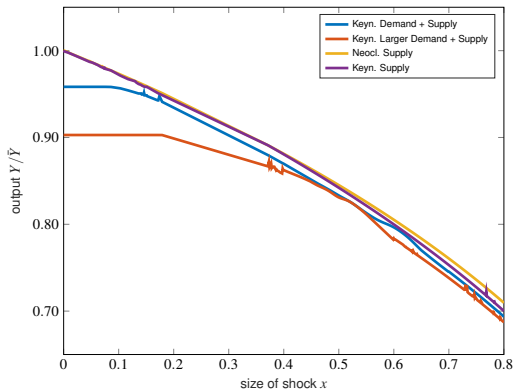


- Survey from McKinsey: "Over the next 2 weeks, do you expect that you will spend more, about the same, or less money on these categories than usual?"
- Histogram bars: fraction of respondents who said "increase" minus fraction of respondents who said "decrease".

## Interaction of Labor Supply and AD Shocks

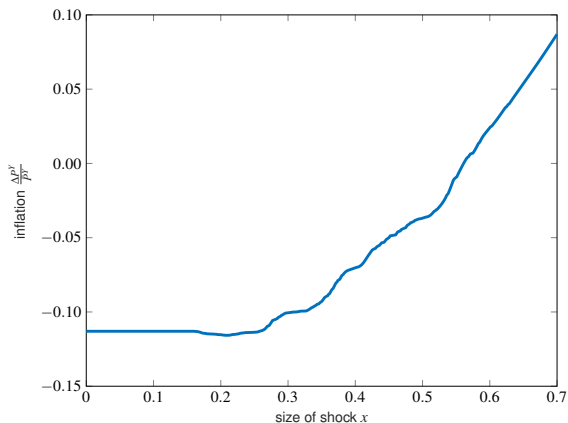
- AD shock and labor-supply shocks *together*.
- Scale negative labor-supply shock  $x$  as before.
- Combine with fixed negative AD shock  $\Delta \log \zeta \in \{-0.1, -0.2\}$ .

# Labor Supply and AD Shocks: Output



- A given negative AD shock matters *less* for output with larger negative supply shocks.

## Labor Supply and AD Shocks: Inflation



- A given negative AD shock matters *a lot* for inflation even with large negative supply shocks.

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## More in Paper

- Semi-downward-flexible wages.
- Policy: monetary, fiscal...
- More “kinks”: endogenous demand and supply shocks.

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## Conclusion

- Covid-19 large heterogenous shock.
- Supply shocks and demand shocks.
- Triggers neoclassical and Keynesian nonlinearities.
- Important qualitatively and quantitatively.
- Important for designing policy response.
- Revisit numbers as data becomes available.