

# On the Persistence of the China Shock

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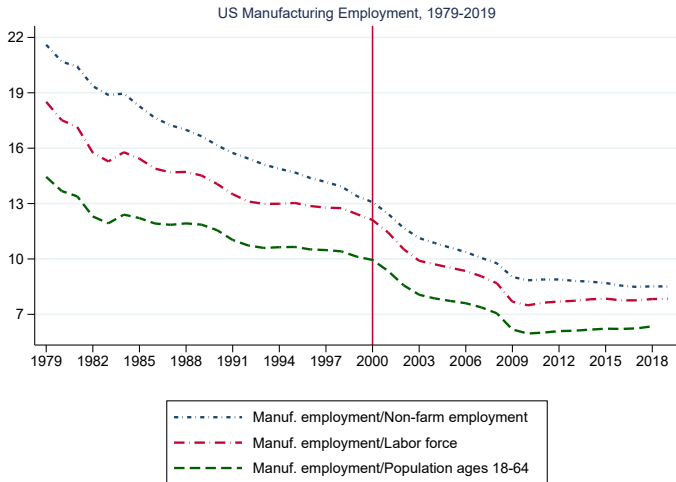
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# Evolution of US Manufacturing Employment



Note: Employment is from CES; labor force is from CPS; population is from NVSS.

# What We've Learned from the China Trade Shock

- In regions subject to larger adverse trade shocks
  - Substantial (relative) declines in mfg employment
  - Little adjustment in non-mfg employment, population headcounts
  - Larger declines in relative earnings for low-wage workers
  - Greater takeup of government transfers
- Quantitative GE analysis
  - Positive but small ACR-type gains for US ( $<0.3\%$ )
  - Aggregate job loss in US manufacturing
  - Number of regions that loose from China shock is small
- Social, political consequences
  - Greater social dislocation in more adversely affected regions
  - Stronger right-wing political shift in harder hit (white) areas

# Selected Literature on the China Trade Shock

- **Regional employment, earnings, migration, public finance**
  - ADH '13, '15, '19; Chetverikov et al '16; Greenland et al '16, '19; Feler Senses '17; Monte et al '18; Bloom et al '20; Pierce Schott '20
- **Industries, innovation, product prices**
  - Bernard et al '06; ADHS '14; Bloom et al '15; AADHP '16; Pierce Schott '16; Amiti et al '17; Handley Limão '17; Asquith et al '19; ADHPS '19; Erickson et al '19; Feenstra et al '19; Jaravel Sager '20
- **Quantitative GE analysis**
  - Hsieh Ossa '16; Caliendo et al '19; Adão et al '20; Galle et al '20; Kim Vogel '20; Rodriguez-Clare et al '20
- **Political economy**
  - Fiegenbaum Hall '15; Colantone Stanig '18a,b; Grossman Helpman '18; Gennaioli Tabellini '19; ADHM '20; Chen et al '20; Rodrik '20
- **Identification and inference**
  - Adão et al '19; Borusyak et al '20; Goldsmith-Pinkham et al '20

# Open Questions

- How permanent is job loss in harder hit regions?
  - Do mfg emp, emp-pop ratios, average incomes recover? Does non-mfg emp eventually expand? Do gov't transfers offset lost income?
    - *Indicates horizons over which different adj. mechanisms operate*
- How strong are (detectable) regional spillovers in shock impacts?
  - Do pop. headcounts ultimately decline in harder hit regions? Do shocks in other regions matter materially for local outcomes?
    - *Indicates extent to which US CZs approximate SOEs*
- How large is the regional variation in income changes?
  - Which moments should quant analysis target for counterfactuals?
    - *Indicates how well quant models capture distributional impacts*

## Other Issues (hidden slide)

- Its technology, not trade, that causes mfg job loss
  - Conditional CZ correlation in trade, tech shocks is small (ADH '15)
- The decline in mfg employment would have happened anyway
  - Scale, speed, and localization of job loss determines its scarring effects (Jacobson et al '93; Davis von Watcher '11)
- There's nothing special about job loss due to trade
  - Trade creates exposure to shocks than can have large, rapid, highly localized impacts (shock concentration, intensity matter for welfare)
- RF empirical analysis isn't informative about aggregate outcomes
  - RF analysis is informative (if not determinative) if regions approximate SOEs and variance in outcomes across regions is large

# Preview of Findings

- **Shock duration**
  - China trade shock plateaus around 2010, doesn't unwind
    - *We observe impacts for nearly decade past shock culmination*
- **Impact duration, adjustment mechanisms**
  - Declines in employment, personal income last to 2018, gov't transfer uptake is long-lasting but modest (mostly Soc Sec, Medicare)
    - *Even over long horizons, exit from work is primary adj. mechanism*
- **Spillovers, distributional impacts**
  - Population changes are null to 2018 (except for 25-39 age group), evidence of gravity-based spillovers between regions is weak, shock-induced regional variation in personal income is large
    - *Reduced-form variation in  $\Delta$  income  $>$  quant analysis*

# Agenda

## 1 Duration of China Trade Shock

## 2 Empirical Specification

## 3 CZ Level Analysis

Employment/Working-Age Population

Log Population Head Counts

Income and Transfers per capita

Heterogeneity in CZ Adjustment

## 4 Implications for Welfare

## 5 Conclusions

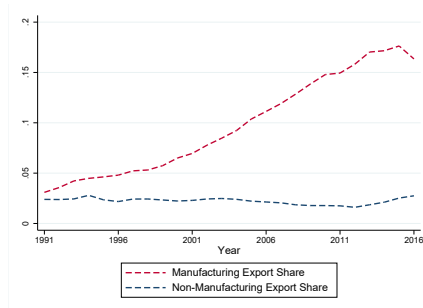


# China Trade Shock from Beginning to End

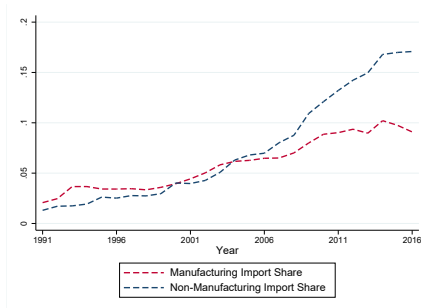
- **Initiation: Deng's famous southern tour** (Naughton, '07)
  - *Lowering input tariffs* (Yu '10; Brandt & Morrow '17)
  - *Reducing uncertainty* (Pierce & Schott '16; Handley & Limao '17)
  - *Removing export restrictions* (Bai et al. '17)
  - *Easing limits on FDI* (Feenstra & Hanson '05)
  - *Phasing out SOEs* (Khandelwal et al '13; Hsieh & Song '15)
  - *Migration, reduced spatial misallocation* (Brandt et al. '13; Fan '19)
  - *Yuan suppression* (Cheung et al. '07; Bergsten & Gagnon '17)
  - *Residual productivity growth* (Brandt et al. '17, '19; Liu & Ma '18)
- **Culmination, Regression: The state strikes back** (Lardy '19)
  - *End of transition-driven growth* (Song et al. '11)
  - *Hu, Xi rollback of reforms* (Naughton '17)

# Timing of the China Trade Shock: 1991-2001-2010

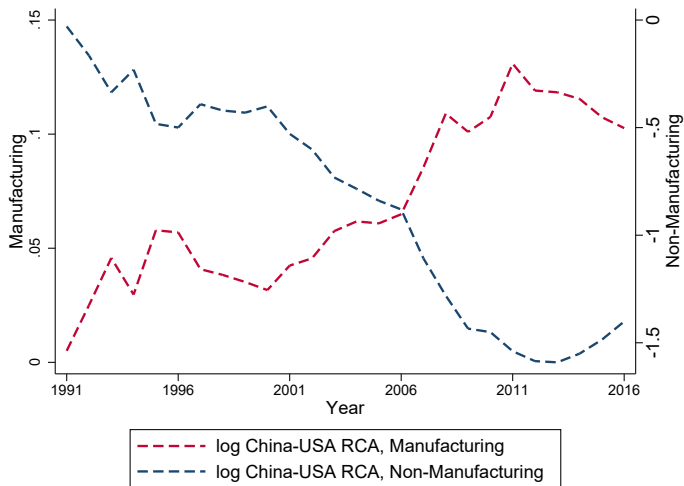
(a) China Share of World Exports



(b) China Share of World Imports



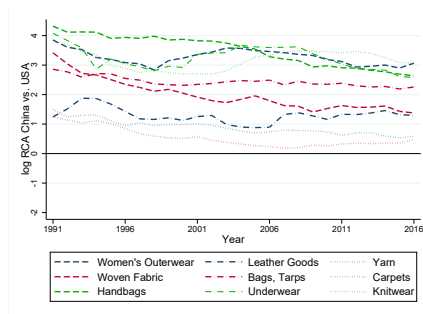
# Plateauing of the China Trade Shock: 2008-2012



Note: Revealed Comparative Advantage (RCA) is country share of world exports in sector/country share of world exports of all merchandise.

# Early Comparative Advantage Products

(a) China-US Log RCA (*decreasing*)    (b) China share of World Exports (*slow rise*)

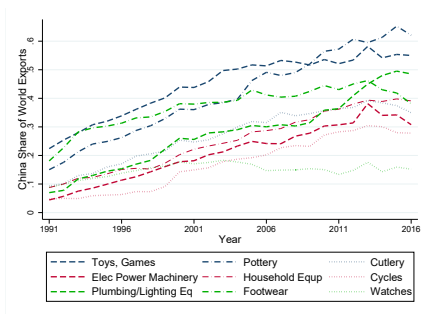
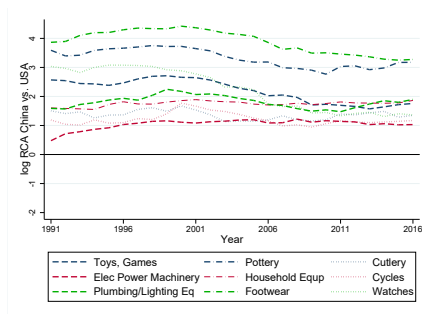


Note: Revealed Comparative Advantage (RCA) is country share of world exports in sector/country share of world exports of all merchandise.

# Middle Comparative Advantage Products

(a) China-US Log RCA (*stable*)

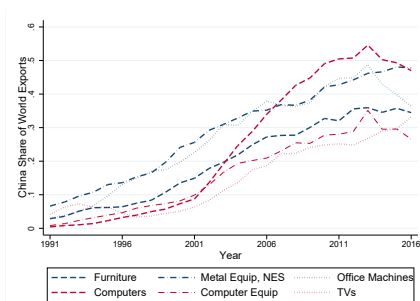
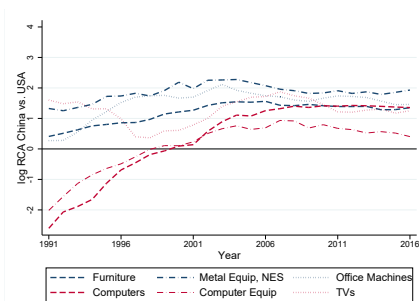
(b) China share of World Exports (*steady rise*)



Note: Revealed Comparative Advantage (RCA) is country share of world exports in sector/country share of world exports of all merchandise.

# Late Comparative Advantage Products

(a) China-US Log RCA (*increasing*)    (b) China share of World Exports (*sharp rise*)



Note: Revealed Comparative Advantage (RCA) is country share of world exports in sector/country share of world exports of all merchandise.

# Agenda

## ① Duration of China Trade Shock

## ② Empirical Specification

## ③ CZ Level Analysis

Employment/Working-Age Population

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Income and Transfers per capita

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## ④ Implications for Welfare

## ⑤ Conclusions

# CZ Level Analysis (varying time differences)

Commuting Zone  $i$ , initial period  $t = 2000$ ,  $h = 1, \dots, 18$

$$\Delta Y_{it+h} = \alpha_t + \beta_{1h} \Delta IP_{i\tau}^{cu} + \mathbf{X}_{it}' \beta_2 + \varepsilon_{it+h},$$

- $\Delta Y_{it+h}$  = change in outcome (employment, population, income)
- $\Delta IP_{i\tau}^{cu}$  = change in import penetration over  $\tau$  (2000-2012)
- $\mathbf{X}_{it}$  = initial-period controls
  - time trends for Census regions, period dummy
  - sum of CZ mfg industry employment shares
  - CZ routine-task intensity, offshorability, female emp. share, foreign-born pop. share, college-educated pop. share, non-white pop. share, ages 0-17, 18-39, 40-64 pop. shares



## (I) Defining Import Competition Shocks

**$\Delta$  import penetration from China for industry  $j$  and CZ  $i$**

$$\Delta IP_{j,\tau} = \frac{\Delta M_{j,\tau}^{cu}}{Y_{j,91} + M_{j,91} - E_{j,91}}, \quad \Delta IP_{i\tau}^{cu} = \sum_j s_{ijt} \Delta IP_{j\tau}^{cu}$$

- $\Delta M_{j\tau}^{cu}$  is  $\Delta$  in China imports over  $\tau$  in US industry  $j$
- $Y_{j,91} + M_{j,91} - E_{j,91}$  is industry absorption in '91 (pre-China shock)
- $s_{ijt} \equiv L_{ijt}/L_{it}$  is initial share of industry  $j$  in CZ  $i$ 's employment

Change in import penetration (10 yr. equivalent)				
time pd.	mean	sd	p25	p75
'91-'00	0.953	0.609	0.570	1.225
'00-'12	0.890	0.585	0.506	1.174
Total	0.921	0.598	0.525	1.174

## (II) Instrumental Variables Approach

### Instrumental variables approach

- IV for US imports from China using other DCs (Austria, Denmark, Finland, Germany, Japan, New Zealand, Spain, Switzerland)
- Assumption: Common component of  $\Delta$  in rich country imports from China is China export supply shock

$$\Delta IP_{it}^{co} = \sum_j s_{ijt-10} \Delta IP_{j\tau}^{co}$$

where  $\Delta IP_{it}^{co} = \Delta M_{j\tau}^{co} / (Y_{j,88} + M_{j,88} - E_{j,88})$  is based on change in imports from China in other high-income countries

# Identifying Restrictions (BHJ '20)

For instrument  $\Delta IP_{i\tau}^{co}$  to be orthogonal to residual  $\varepsilon_{it+h}$ :

$$\mathbb{E} \left[ \sum_j s_j \Delta IP_{j\tau}^{co} \bar{\varepsilon}_j \right] = 0, \text{ where } \bar{\varepsilon}_j \equiv \sum_i s_{ij80} \varepsilon_{it+h} / \sum_i s_{ij80}$$

Orthogonality achieved if  $\mathbb{E} [\Delta IP_{i\tau}^{co} | \bar{\varepsilon}_j, s_j] = \mu \forall j$ ,  $\mathbb{E} [\sum_j s_j^2] \rightarrow 0$ , and  $\text{Cov} [\Delta IP_{j\tau}^{co}, \Delta IP_{k\tau}^{co} | \bar{\varepsilon}_j, \bar{\varepsilon}_k, s_j, s_k] = 0 \forall j, k \neq j$  (BHJ '20)

Orthogonality obtains with exogenous shifts ( $\Delta IP_{i\tau}^{co}$ ) or shares ( $s_j$ )

- BHJ '19 results for ADH '13 are consistent w/ exogeneity of shifts
- GPSS '19 approach more logical when small no. of industries matter

# Standard Error Adjustments

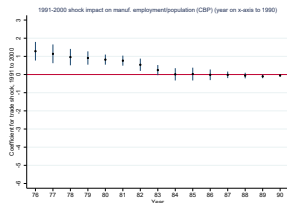
- If primary unobserved shocks are at national industry level:
  - CZ-level regression has industry-level representation (BHJ '20); re-weighted SEs for impact on mfg emp/wkg-age pop ( $\beta = -0.596$ )
    - ADH '13: *std. error* = 0.099
    - BHJ '20: *std. error* = 0.114
  - Challenges to inference in finite samples (AKM '19), where corrected confidence intervals may be asymmetric
    - ADH '13: 95% *CI* =  $[-0.794, -0.398]$
    - AKM '19: 95% *CI* =  $[-1.010, -0.360]$

### (III) Sensitivity, Falsification

- Industry-level and pre-trend analysis, lagged controls (BHJ '19, '20)
- Gravity-based regional spillovers (AAE '20)
- Alternative controls for population dynamics (Greenland et al '19)
- Alternative definitions of shock period (Bloom et al '20)
- Alternative measures of employment (CBP, REIS, LAUS)

# Pre-Trends ( $T_0$ -’91 changes on ’91-’00 trade shock)

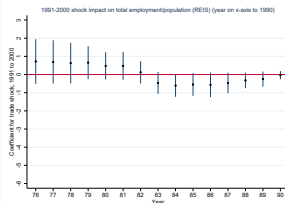
(a) Mfg emp/Working-age pop



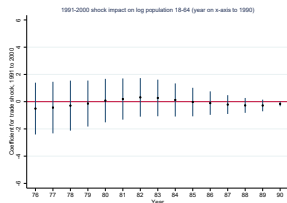
(b) Nonmfg emp/Working-age pop



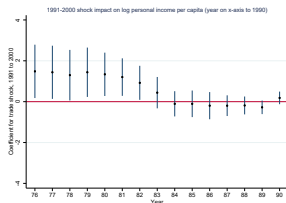
(c) Total emp/Working-age pop



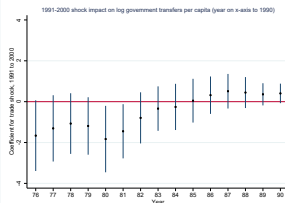
(a) Log working-age pop



(b) Personal income per capita

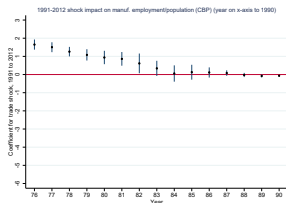


(c) Gov't transfers per capita

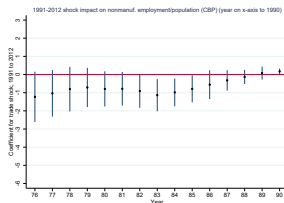


# Pre-Trends ( $T_0$ -’91 changes on ’91-’12 trade shock)

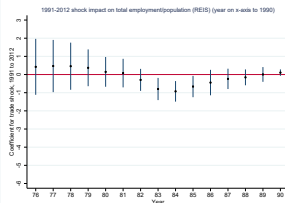
(a) Mfg emp/Working-age pop



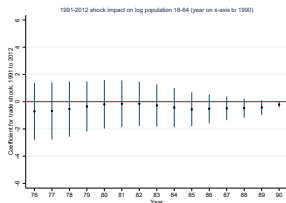
(b) Nonmfg emp/Working-age pop



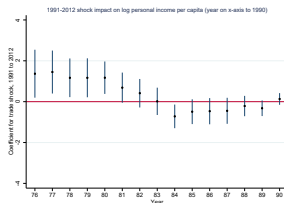
(c) Total emp/Working-age pop



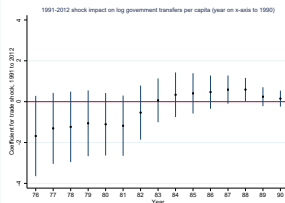
(a) Log working-age pop



(b) Personal income per capita

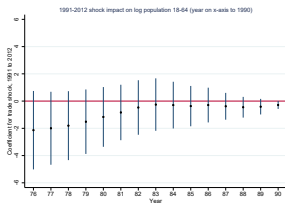


(c) Gov't transfers per capita

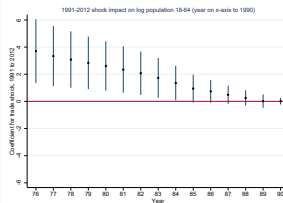


# Pre-Trends for Pop. Growth with Varying Controls

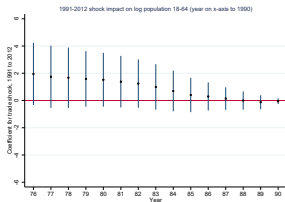
(a) No controls



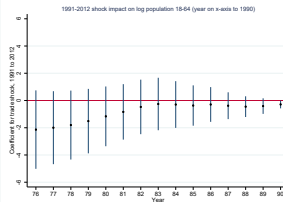
(b) Add initial mfg emp share



(c) Add region dummies



(b) Add lagged pop growth





## (IV) Dynamics of the China Trade Shock

Commuting Zone  $i$ , initial period  $t$  ('00),  $h = 1, \dots, 18$

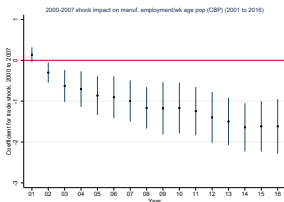
$$\Delta Y_{it+h} = \alpha_t + \beta_{1h} \Delta IP_{i\tau}^{cu} + \mathbf{X}'_{it} \beta_2 + \varepsilon_{it+h},$$

- Trade shocks and IVs are highly correlated across decades
  - $\Delta IP_{i\tau}^{cu}$  for '00-'12 and '91-'00 have correlation of 0.57
  - $\Delta IP_{i\tau}^{co}$  for '00-'12 and '91-'00 have correlation of 0.73
- Evaluate dynamics in CZ labor-market adjustment by regressing:
  - '00s outcomes on '90s shock
  - '00s outcomes on '00s and '90s shocks
  - '00s outcomes on '00s shock and '90s residualized shock
  - '00s outcomes on '90s shock and '00s residualized shock

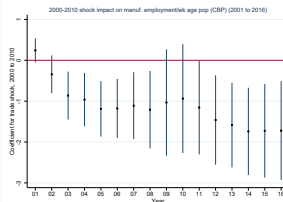
# Dynamics in CZ adjustment (?)

## Varying trade shock lengths on $\Delta$ mfg emp/working age pop

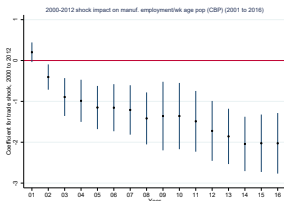
(a) '00-'07 trade shock



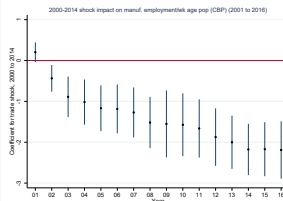
(b) '00-'10 trade shock



(c) '00-'12 trade shock



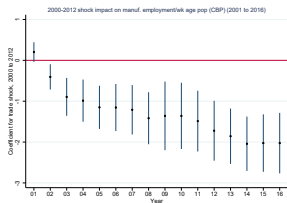
(d) '00-'14 trade shock



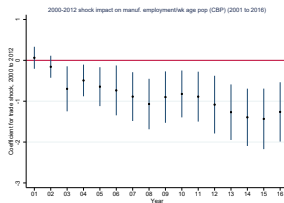
# Dynamics in CZ adjustment (?)

## Impact of '00-'12 trade shock on $\Delta$ mfg emp/working age pop

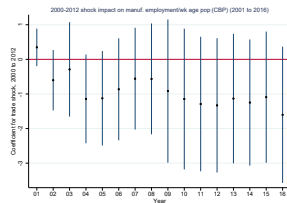
(a) '00-'12 trade shock



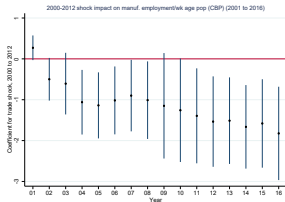
(b) '90-'00 trade shock



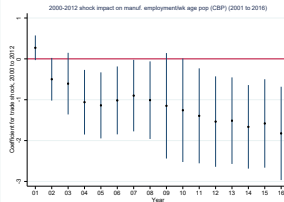
(c) '00-'12 & '90-'12 shocks



(d) '00-'12 shock & resid. '91-'00 shock



(e) '90-'00 shock & resid. '00-'12 shock



# Agenda

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## ④ Implications for Welfare

## ⑤ Conclusions

# Labor Market Outcomes

'00-'16 change in:	mean	sd	p25	p75
mfg emp/pop	-3.86	2.03	-4.82	-2.49
nonmfg emp/pop	2.16	3.87	0.55	4.26
tot emp/pop	-1.70	4.24	-3.83	0.14
unemp/pop	0.61	0.58	0.18	0.99
ln pop 40-64	19.69	12.61	12.73	27.72
ln pop 18-39	5.83	11.89	-1.90	14.18
ln total pop	12.66	12.07	4.78	20.47
personal income/pop	\$9,013.44	\$3,928.26	\$6,411.87	\$11,608.44
labor comp/pop	\$2,146.01	\$2,150.53	\$755.00	\$3,396.24
gov't transfers/pop	\$3,551.82	\$675.95	\$3,097.03	\$3,915.57
TAA benefits/pop	-\$0.88	\$3.32	-\$1.45	\$0.52
UI benefits/pop	\$2.30	\$36.58	-\$19.45	\$30.14
SSA benefits/pop	\$911.21	\$282.62	\$691.70	\$1,106.53
Medicare benefits/pop	\$1,030.95	\$241.75	\$883.41	\$1,178.03

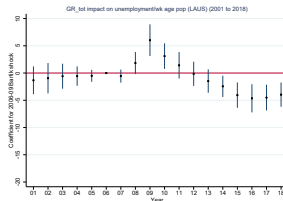
# What “Should” Labor-Market Adjustment Look Like?

## Adjustment to Bartik Employment Shock for Great Recession, '06-'09

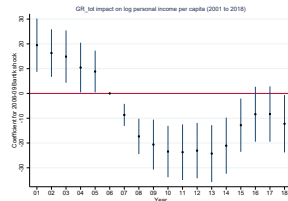
(a) Mfg emp/Wk age pop



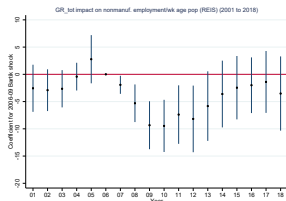
(c) Unemployment/Wkg-age pop



(e) Log personal income per capita



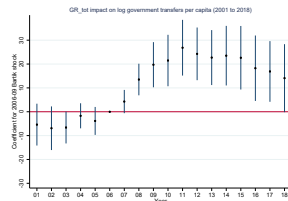
(b) Non-mfg emp/Wkg age pop.



(d) Total Emp/Wkg-age pop.



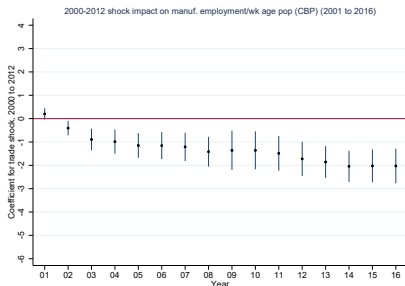
(f) Log gov't transfers per capita



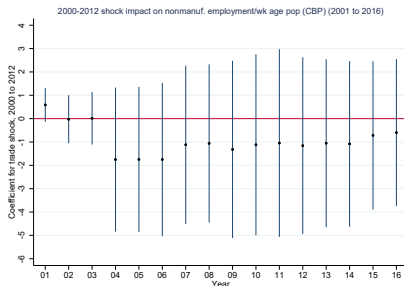
# Trade Shock Impacts on Mfg, Non-Mfg Employment (CBP)

'00-'16: Decline in mfg emp, no increase in non-mfg emp

(a) Mfg emp/Working age pop



(b) Non-mfg emp/Working age pop

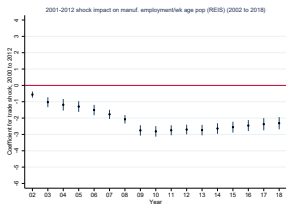


Note: Single time difference for '00-'16 (trade shock '00-'12).

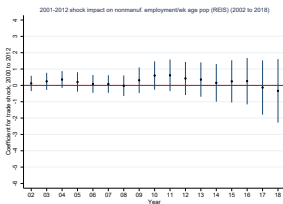
# Impacts on Mfg, Non-Mfg Employment (REIS)

Decline in mfg emp, no increase in non-mfg emp

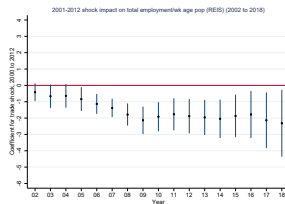
(a) Mfg emp/Wk age pop



(b) Non-mfg emp/Wk age pop



(c) Total emp/Wk age pop



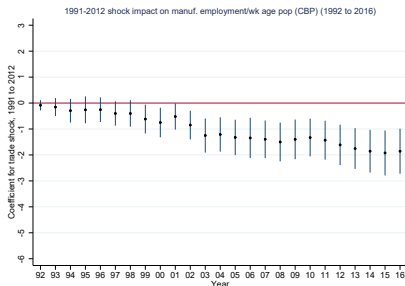
Note: Single time difference for '00-'18 (trade shock '00-'12). Non-mfg is private non-farm activity less manufacturing.



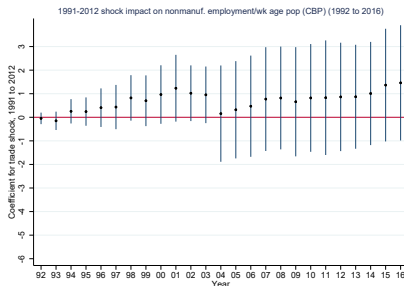
# Impacts on Mfg, Non-Mfg Employment (CBP)

'91-'16: Decline in mfg emp, imprecise change in non-mfg emp

(a) Mfg emp/Working age pop



(b) Non-mfg emp/Working age pop



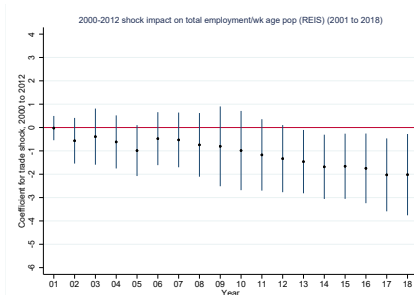
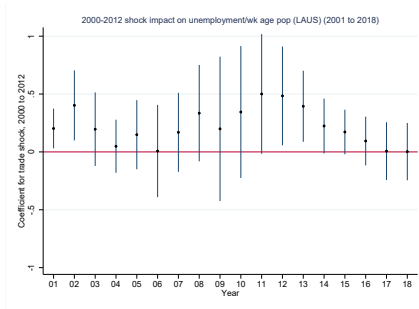
Note: Single time difference for '91-'16 (trade shock '91-'12).

# Impacts on Unemployment, Total Employment (LAUS, REIS)

**SR increase in unemployment, LR decrease in emp-pop ratio**

(a) Unemployment/Working-age pop.

(b) Total Employment/Working-age pop.

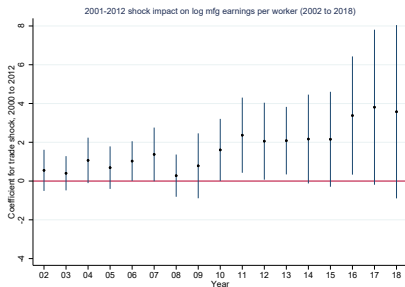


Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12.

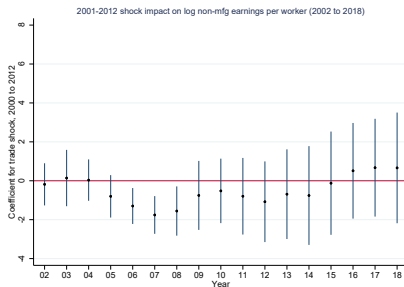
# Impacts on Mfg, Non-Mfg Earnings

## Mild positive selection of workers who stay employed in mfg

(a) Mfg earnings per worker (REIS)



(b) Non-mfg earnings per worker (REIS)



Note: Single time difference for '00-'16 (trade shock '00-'12). Non-mfg is private non-farm activity less manufacturing.

# CZ Level Analysis with Gravity Spillovers (AAE '20)

Commuting Zone  $i$ , initial period  $t$  ('00),  $h = 1, \dots, 18$

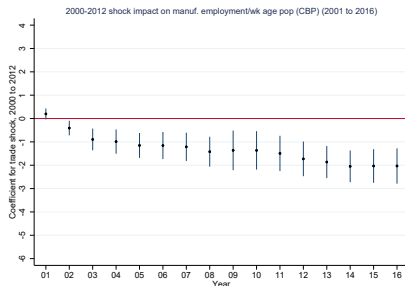
$$\Delta Y_{it+h} = \alpha_t + \beta_{1h} \Delta IP_{i\tau}^{cu} + \beta_{2h} \sum_k z_{ikt} \Delta IP_{k\tau}^{cu} + \mathbf{X}_{it}' \beta_2 + e_{it+h}.$$

- $\Delta Y_{it+h}$  = change in outcome (employment, population, income)
- $\Delta IP_{i\tau}^{cu}$  = change in IP over  $\tau$  ('91-'00, '00-'12),  $z_{ikt} \equiv \frac{L_{kt} D_{ik}^{-\delta}}{\sum_h L_{ht} D_{ih}^{-\delta}}$
- $\mathbf{X}_{it}$  = initial-period controls

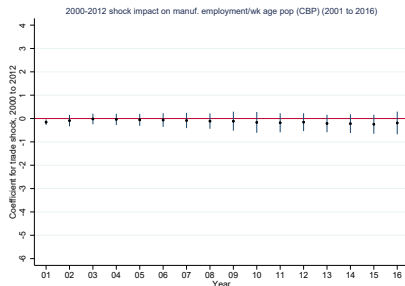
# Impacts of Gravity-based Spillovers on Mfg Emp (CBP)

Local shock impact unchanged, no gravity shock impact

(a) Impact of Local Trade Shock



(b) Impact of Gravity-Based Trade Shock

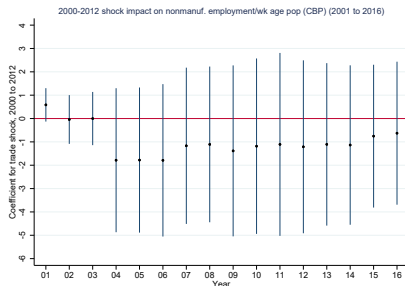


Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12.

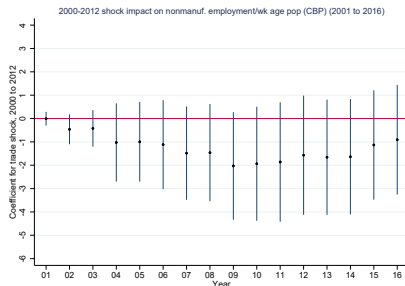
# Impacts of Gravity-based Spillovers on Non-Mfg Emp (CBP)

Local shock impact unchanged, imprecise gravity shock impact

(a) Impact of Local Trade Shock



(b) Impact of Gravity-Based Trade Shock

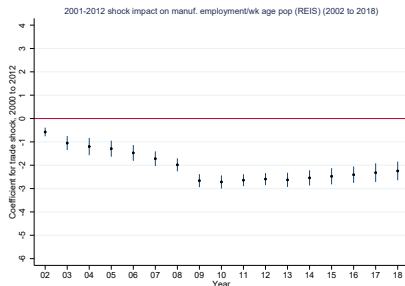


Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12.

# Impacts of Gravity-based Spillovers on Mfg Emp (REIS)

Local shock impact unchanged, no gravity shock impact

(a) Impact of Local Trade Shock



(b) Impact of Gravity-Based Trade Shock

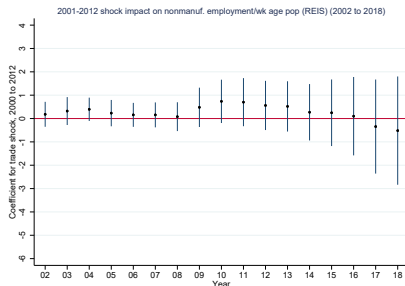


Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12.

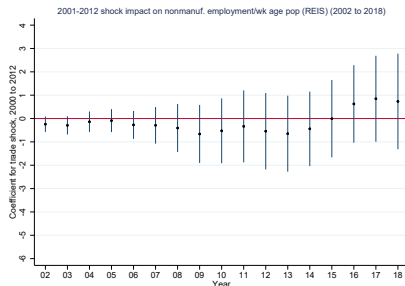
# Impacts of Gravity-based Spillovers on Non-Mfg Emp (REIS)

Local shock impact unchanged, imprecise gravity shock impact

(a) Impact of Local Trade Shock



(b) Impact of Gravity-Based Trade Shock



Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12.



# Agenda

## ① Duration of China Trade Shock

## ② Empirical Specification

## ③ CZ Level Analysis

Employment/Working-Age Population

Log Population Head Counts

Income and Transfers per capita

Heterogeneity in CZ Adjustment

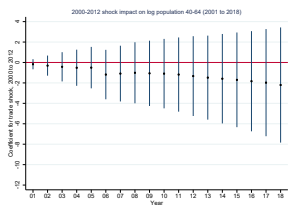
## ④ Implications for Welfare

## ⑤ Conclusions

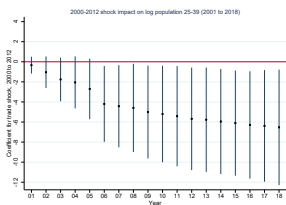
# Impacts on Population by Age (lagged pop. growth controls)

Precise impacts only for 25-39 yr olds (36% wkg age pop in '00)

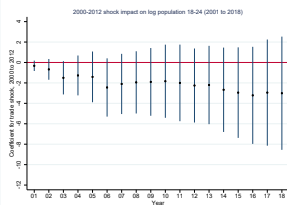
(a) In population 40-64



(b) In population 25-39



(c) In population 18-24



Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12; controls include CZ pop. growth '70-'90 (Greenland et al '19).

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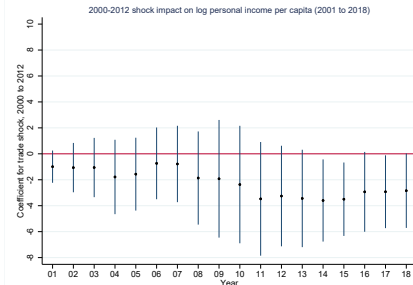
## ④ Implications for Welfare

## ⑤ Conclusions

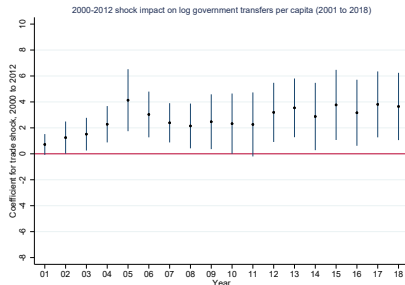
# Impact on Personal Income (USD '15) per capita

## Declines in personal income out to 2018

(a) Personal income



(b) Government transfers



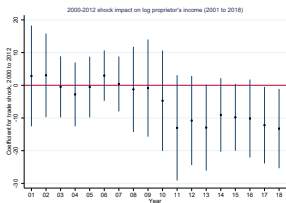
Note: Stacked time differences for initial pds '91, '00; trade shock pds: '91-'00, '00-'12; personal income includes wages, salaries, bonuses, employer benefits, business income, financial returns (rent, interest, dividends, realized capital gains), and gov't transfers.

# Impact on Components of Personal Income per capita

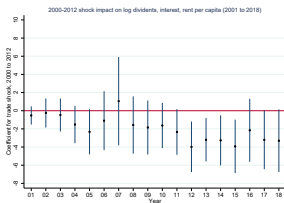
(a) Wages, salaries, benefits



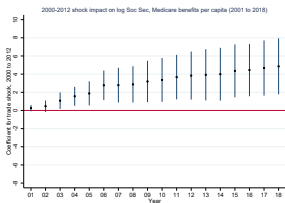
(b) Proprietor's income



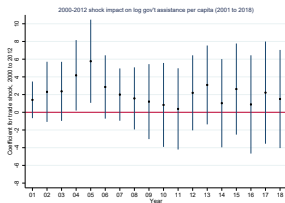
(c) Dividends, interest, rent



(d) Soc Sec, SSDI, Medicare

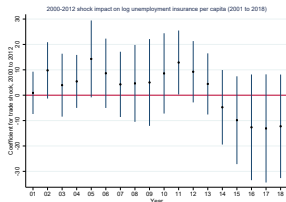


(e) Other Gov't assistance

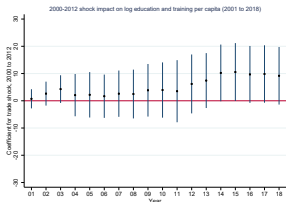


# Impact on Log Government Assistance per capita

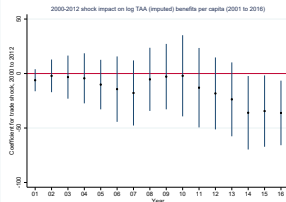
(a) UI benefits



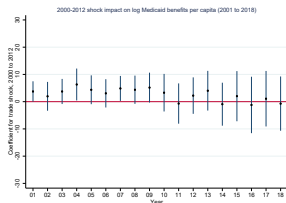
(b) Education & Training benefits



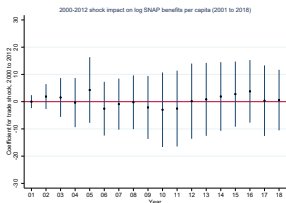
(c) TAA payments



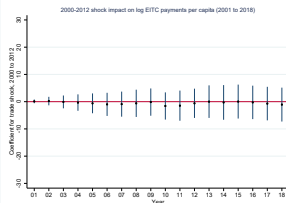
(d) Medicaid benefits



(e) SNAP benefits



(f) EITC benefits



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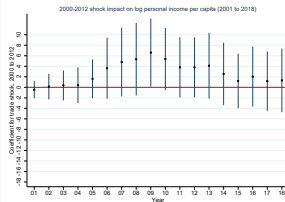
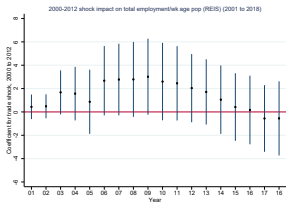
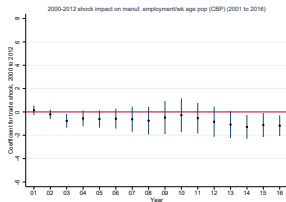
# Heterogeneity by Initial CZ Emp-Pop Ratio

(A) Mfg emp/Wkg age pop

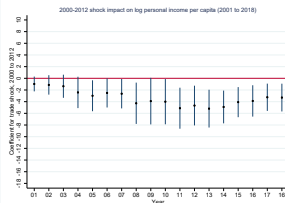
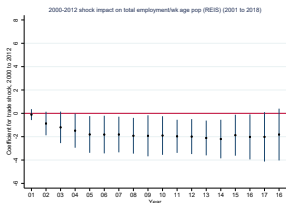
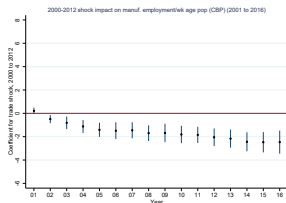
(B) Total emp/Wkg age pop

(C) Log personal income per capita

(I) Below median emp-pop ratio in 2000



(II) Above median emp-pop ratio in 2000





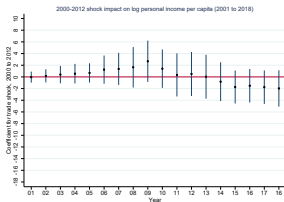
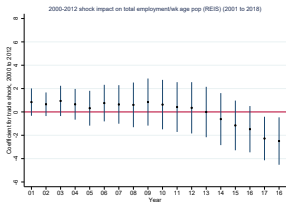
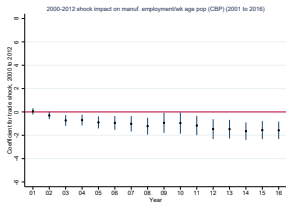
# Heterogeneity by Initial CZ College Share

(A) Mfg emp/Wkg age pop

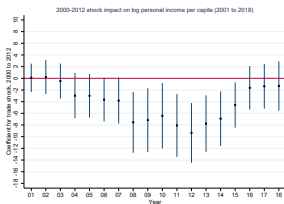
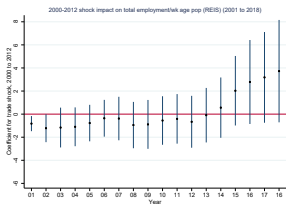
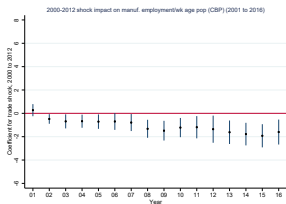
(B) Total emp/Wkg age pop

(C) Log personal income per capita

(I) Below median college educated share in 2000



(II) Above median college educated share in 2000



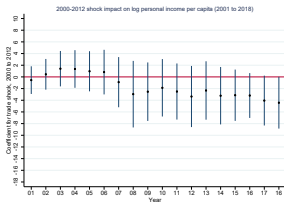
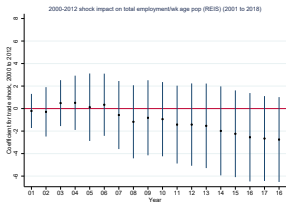
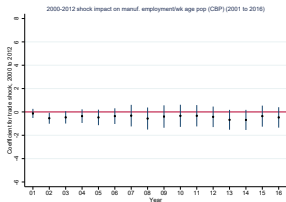
# Heterogeneity by Initial Occupational Specialization

(A) Mfg emp/Wkg age pop

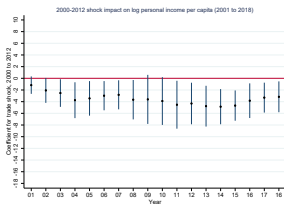
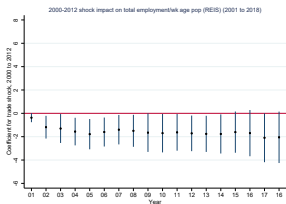
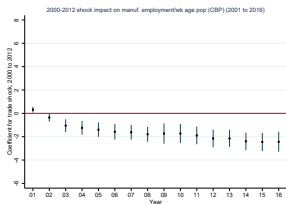
(B) Total emp/Wkg age pop

(C) Log personal income per capita

(I) Below median occupation specialization (HHI) in 2000



(II) Above median occupation specialization (HHI) in 2000



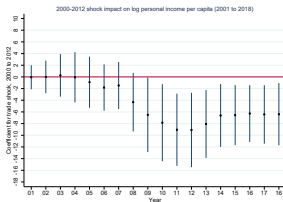
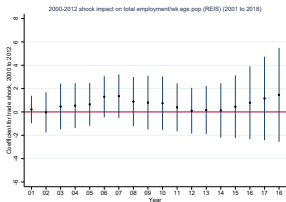
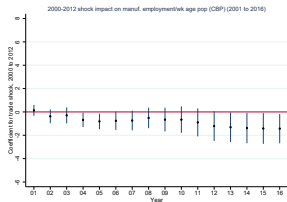
# Heterogeneity by Initial Industrial Specialization

(A) Mfg emp/Wkg age pop

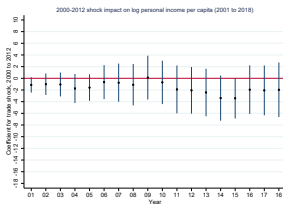
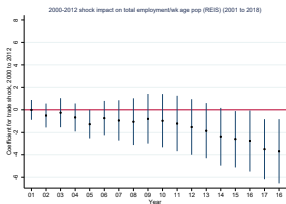
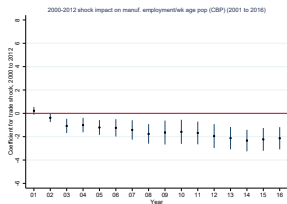
(B) Total emp/Wkg age pop

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(I) Below median industry specialization (HHI) in 2000



(II) Above median industry specialization (HHI) in 2000



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# Counterfactual Analysis of China Shock, 2000–2007

- **Caliendo et al '19: costly labor mobility**
  - Estimate mobility elasticity  $v$  from  $E \left[ \ln \mu_t^{j,k} / \mu_t^{j,j} \mid \ln w_{t+1}^k / w_{t+1}^j \right]$
  - $\% \Delta \bar{W} (std. dev.) = 0.20 (0.09)$  in long run (12 years)
- **Galle et al '20: specific factors**
  - Estimate labor specificity  $\kappa$  from  $E [\ln \hat{y}_j \mid \ln \hat{\pi}_{jNM}]$
  - $\% \Delta \bar{W} (std. dev.) = 0.22 (0.25)$ , similar w/ home prod., unemploy.
- **Adão et al '20: agglomeration effects**
  - Estimate agglom, employ elasticities  $\psi, \phi$  from  $E \left[ \ln \hat{w}_j, \ln \hat{L}_j \mid \hat{\eta}_j^P, \hat{\eta}_j^C \right]$
  - $\% \Delta \bar{W} (std. dev.) = 0.16 (1.75)$
- **Related work:**
  - Rodriguez-Clare et al '20: Downward nominal wage rigidities
  - Kim & Vogel '20: Non-pecuniary losses from unemployment

## CZ Level Changes in Welfare (GRCY '20)

Change in welfare for region  $i$  of US is product of standard ACR component and new Roy-Fréchet component (where  $\hat{x} \equiv x_1/x_0$ )

$$\hat{W}_i = \frac{\hat{Y}_i}{\hat{L}_i} \prod_j \hat{P}_j^{-\beta_j} = \prod_j \hat{\lambda}_j^{-\beta_j/\theta} \prod_j \hat{\pi}_{ij}^{-\beta_j/\kappa}$$

- $\hat{W}_i$  = change in real income in region  $i$
- $\hat{P}_j$  = change in product price for industry  $j$
- $\beta_j$  = Cobb-Douglas expenditure share for industry  $j$
- $\hat{\lambda}_j$  = change in US expenditure share on its own  $j$  goods
- $\hat{\pi}_{ij}$  = change in employment share of industry  $j$  in region  $i$

# Relative Changes in CZ Welfare

Trade-shock induced change in welfare for CZ  $i$  (conditional on controls) relative to the population-weighted US mean:

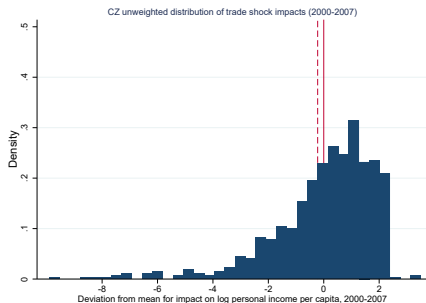
$$\begin{aligned}\ln \hat{W}_i - \sum_h s_h \ln \hat{W}_h &= \ln \hat{y}_i - \sum_h s_h \ln \hat{y}_h \\ &= \tilde{\beta}_{y\tau} \Delta \tilde{IP}_{i\tau}^{cu} - \sum_h s_h \tilde{\beta}_{y\tau} \Delta \tilde{IP}_{h\tau}^{cu}\end{aligned}$$

- $s_i$  = initial share of CZ  $i$  in US population
- $\hat{y}_i$  = trade-shock induced change in income per capita in CZ  $i$
- $\tilde{\beta}_{y\tau}$  = estimated impact coefficient for  $\ln y$  over time interval  $\tau$
- $\Delta \tilde{IP}_{i\tau}^{cu}$  = exogenous component of trade shock for CZ  $i$  (observed trade shock  $\times \hat{\beta} \times \text{adj. } R^2$  in 1<sup>st</sup> stage regression)

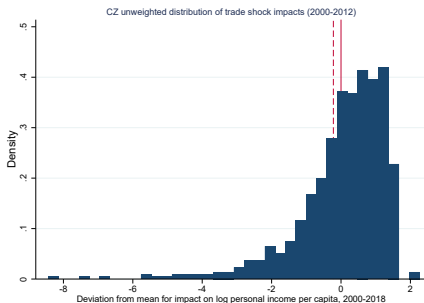
# Trade-shock-induced Variance in $\Delta$ Income per capita

Unweighted distribution of CZ changes (deviation from pop.-weighted mean)

(a) 2000-2007 Trade Shock



(b) 2000-2012 Trade Shock



Note: Wted (unwted) std. dev. of shock impact: (a) 1.35 (2.15), (b) 1.30 (0.95);  $N = 722$ , 36 bins.



# Most Trade Impacted Commuting Zones, 2000-2018

Commuting Zone	Population 2000 (000s)	Manuf. emp. share 2000 (%)	2000-2018
			Predicted $\Delta$ income per capita (%)
Sioux City, IA	187.6	27.0	-8.44
Union County, MS	54.4	50.1	-7.32
Meridian, MS	156.9	26.5	-6.82
Hutchinson, MN	73.0	41.5	-5.73
North Hickory, NC	377.5	43.0	-5.70
Tupelo, MS	198.1	43.7	-5.34
Martinsville, VA	19.4	47.4	-4.94
Carroll County, VA	27.5	45.1	-4.71
Lynchburg, VA	112.4	26.9	-4.62
West Hickory, NC	165.1	49.9	-4.55
Henderson County, TN	44.9	45.9	-4.35
Crossville, TN	104.5	35.6	-4.15
Raleigh-Cary, NC	1,420.0	17.0	-4.11
Cleveland, TN	203.7	39.9	-3.75
McMinnville, TN	84.5	48.9	-3.72
Faribault-Northfield, MN	110.1	32.9	-3.67
St. Marys, PA	41.0	54.7	-3.64
Danville, KY	86.7	38.3	-3.44
Quincy, IL	152.3	23.8	-3.37
Greene County, GA	35.5	41.1	-3.16

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# Discussion

## Local impacts of exposure to import competition are long lasting

- Declines in mfg, total employment persist for 16-18 years

## Primary means of labor-market adjustment is exit from work

- Social insurance (pensions, disability) may contribute to this

## Regional variation in changes in income per capita is large

- Gov't transfers do little to offset income losses

## To-be-examined adjustment mechanisms

- Changes in housing prices (owners vs. renters), non-mfg exports