

# Direct-to-Consumer Trade and the Value of De Minimis

Preliminary, Draft Available Soon

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# Motivation

- US tariffs on Chinese imports have increased dramatically since 2018
- Section (§) 321 of the 1930 Trade Act
  - ▶ \$800/person per day can arrive duty-free and w/ minimal customs burden
- Use of “de minimis” import channel has exploded in recent years. In 2022:
  - ▶ 685m shipments entered through §321 vs 39.1m formal entries
  - ▶ §321 imports are 6% of consumer imports, and 18% of E-commerce sales
  - ▶ in 2023, 1 *billion* §321 shipments, collectively valued at \$49.4b
- Driven by
  - ▶ emergent “direct-to-consumer” trade integral to online retailers/platforms
  - ▶ higher tariffs

## §321 Importance in US Imports

year	CBP Official Statistics		US Consumer Spending	
	§321 value (\$b) (1)	§321 BOLs (mil) (2)	consumer imports (%) (3)	e-commerce (%) (4)
2012	0.05	110.5	0.01%	0.1%
2013	0.07	117.9	0.01%	0.1%
2014	0.7	122.8	0.1%	1%
2015	1.6	138.9	0.3%	2%
2016	9.2	224.0	1.6%	9%
2017	13.0	332.3	2.1%	11%
2018	29.2	410.6	4.4%	22%
2019	56.2	503.1	8.9%	37%
2020	67.0	636.7	9.4%	30%
2021	43.5	771.5	5.3%	18%
2022	46.5	685.4	6.0%	18%
2023	49.4	1,000.0		

Notes: Panel reports official statistics for §321 imports (columns 1-2) obtained through a FOIA, CBP Publication 2036-1022 and CBP E-Commerce Statistics. Column 3 reports the share of §321 import values to aggregate US spending on consumer imports (excluding autos and food), and column 4 reports the share relative to aggregate E-commerce sales. The latter two statistics are from Census and pulled the FRED database. BOLs means bill of lading.

# Research Questions

- What are the aggregate consequences of allowing for §321 imports?
- Which consumers benefit more vs less from §321 imports?

# De Minimis Trade Policy: Key Forces

- What are the economic impacts of a minimum value threshold for trade policy?
- Shipments above threshold face tariffs and customs processing fees:
  - ▶ standard tariff distortion: tariffs make imports more expensive
  - ▶ fees could be sizeable relative to value of cheap packages
- However, a de minimis tax notch is a novel source of gains from trade
  - ▶ high-price firms bunch at notch, thereby lowering consumer prices
  - ▶ a finite de minimis threshold could be preferred to free trade
- Tradeoffs vary across consumer groups based on their de minimis expenditures

# Data

- Census data exclude de minimis shipments (contain shipments above \$2000)
- We analyze international shipments into the US handled by three carriers
  - ▶ shipments range from \$0 to ~\$100m
  - ▶ analyze 414m shipments, valued at \$709b
- in 2021, these carriers are 36.1% of total §321 value and 17.0% of §321 shipments
- have obtained 1w of §321 shipments from CBP through FOIA, 2017-22
  - ▶ can compare carrier data with a snapshot of the universe of §321 shipments
  - ▶ future versions will use CBP sample to adjust welfare estimates

# Research Design

- Framework
  - ▶ heterogeneous consumers vary in expenditures over DM goods by origin
  - ▶ heterogeneous exporters operate subject to de minimis rules
- Quantification requires two key empirical moments:
  - ▶ density of shipments over values by consumer group (e.g., zipcode income)
  - ▶ change in density from pre-2016 (\$200 threshold, low tariffs) to post-2016 (\$800 threshold, high tariffs)
- Changes in notches and tariffs identify key elasticities:
  - ① within origins across package values
    - ★ exploit change in bunching at the notch Kleven 16
  - ② across origins facing different US tariffs future versions

# Preliminary Findings

- ① §321 spending as a share of income is U-shaped
  - ▶ the lowest and highest income zips have highest spending shares
  - ▶ §321 spending shares higher in zips with a high percentage of non-white hh
  - ▶ within §321, lower-income zipcodes import more from China
- ② Simulate eliminating §321: direct shipments  $\leq$  \$800 face tariffs and processing fees
  - ▶ prices rise 1.5% (or 2.1% with higher fee)
  - ▶ increased consumer costs: \$33.9/yr (or \$46.8/yr with higher fee)
    - ★ compare to  $\uparrow$  \$160/yr costs from 2018 trade war tariffs FKG 2020
  - ▶ accounting for tariff gains, welfare loss per capita: \$14.9/yr
- ③ Distributional impacts from policy experiment:
  - ▶ as % of income, lowest & highest median income zips lose more than middle
  - ▶ zipcodes with higher share of non-white households lose more
  - ▶ if tariff revenue rebated equally, eliminating §321 is regressive:
    - ★ zipcodes with highest white share gain
    - ★ zipcodes with highest non-white share lose
- future versions
  - ▶ calibrate to sample of shipments obtained from CBP
  - ▶ estimate impacts across more demographic characteristics (pop density, broadband access)



# Road Map

- §321 Policy, Data and Descriptive Statistics
- Framework
- Moments and Estimation
- Policy Experiment

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# §321 Import Policy

- Most countries have a de minimis policy (avg \$145)
- US streamline procedures for two types of low-value shipments:
  - ▶ informal entries (\$801-\$2500)
    - ★ subject to tariffs & merchandise processing fees (\$2.22, \$6.66, or \$9.99)
    - ★ CBP Form 7501
    - ★ immediately released by CBP, unlike formal entries (>\$2500)
  - ▶ §321 entries (\$0-\$800)
    - ★ not subject to tariffs or processing fees
    - ★ minimal paper work (simply present BOL or commercial invoice)
- §321 provision
  - ▶ \$800 limit per consignee per day (change from \$200 in March 2016)
  - ▶ CBP captures origin, value, address, item descriptions, no HS codes
  - ▶ cannot break up a single order across shipments that span multiple days
- §321 shipments not present in Census data
  - ▶ Census data pulls from CBP Form 7501, so captures shipments above \$2000

# Carrier Data

- Carriers' universe of international air shipments to US
  - ▶ date, origin, value, address/postal code, items description, entry code
  - ▶ for >\$800 shipments, have HS codes
  - ▶ 2014-22, but incomplete coverage across carriers
  - ▶ across years and carriers, observe 414m shipments valued at \$709b
  - ▶ shipments delivered to virtually all ZCTAs
- Sample also contains shipments to non-US destinations trans-shipped through US
  - ▶ entry codes: 62 "transportation & exportation"    63 "immediate export"
- Representativeness:
  - ▶ 85.7% of §321 shipments enter by air, and 29.9% by private carriers CBP
  - ▶ in 2021, our data are:
    - ★ 17.0% of total §321 shipments
    - ★ 36.1% of total §321 value
  - ▶ can benchmark to sample of  $\leq$ \$1500 shipments obtained via a FOIA from CBP for 1 week in 2017-22
- Zipcode median income, population, demographics from Michigan ICPSR

# Carrier Data

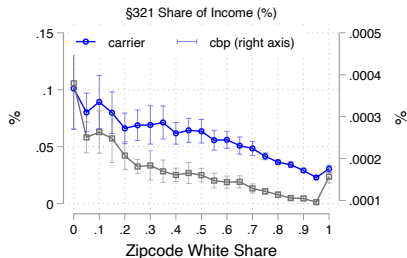
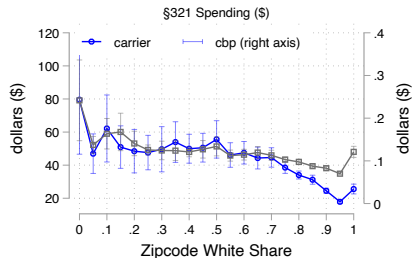
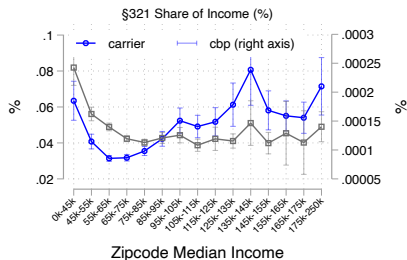
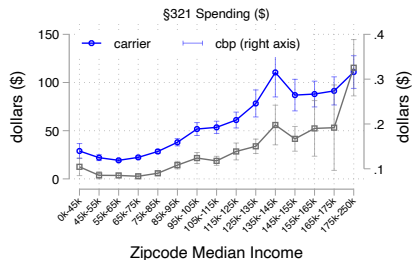
year	carrier	§321 Shipments to USA		Non §321 Imports [\$801,\$5,000]		Shipments to OECD ( $\leq$ \$5,000)	
		§321 value (\$b)	§321 BOLs (m)	value (\$b)	BOLs (m)	value (\$b)	BOLs (m)
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
2014	A	0.2	7.0	1.2	1.1	0.2	0.4
2015	A	0.6	16.1	2.7	2.6	0.5	3.3
2016	A	1.4	18.3	2.4	1.4	0.5	3.4
2017	A	2.8	30.0	3.5	1.7	0.8	5.3
2018	A	3.6	34.3	4.3	2.0	1.0	6.2
2019	A	4.2	36.5	4.6	2.1	1.1	6.5
2020	A B* C	7.9	68.5	8.5	3.9	2.2	11.1
2021	A B C	15.7	130.9	17.3	8.0	2.8	11.0
2022	B* C*	3.6	31.3	5.1	2.4	0.01	0.01

Notes: The table reports summary statistics from the carrier data. Column 1 reports the source carrier; "\*" denotes incomplete data that year. Columns 2-3 report total value and BOLs for §321 imports into US. Columns 4-5 report stats for non-§321 imports under \$5,000 . Columns 6-7 report statistics of transshipments under \$5,000 handled by the carriers to OECD.

# §321 Spending and Demographics

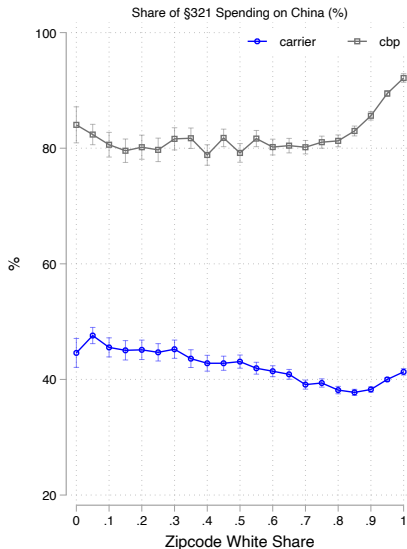
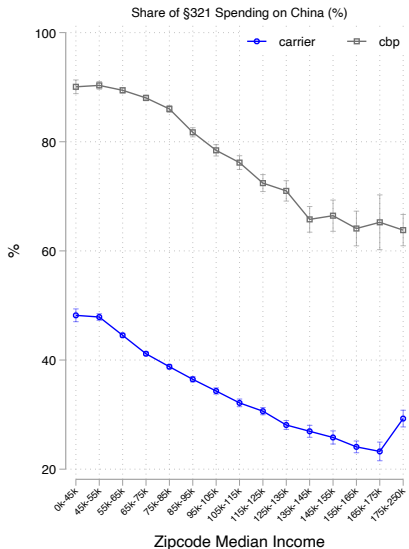
- From 2021 official CBP statistics, §321 spending pc was \$131
- in carrier data, average zipcode §321 spending pc is \$32.6
  - ▶ ratio of zipcode at the 90th vs 10th percentile of §321 spending pc is 10.0
- zipcodes' §321 per capita spending share:
  - ▶ of zipcode median household income: avg 0.04% (90-10 ratio: 7.4)
  - ▶ of zipcode apparel/electronic spending: avg 3.6% (90-10 ratio: 9.6)

# §321 Spending and Demographics



Notes: Top panel: left column plots §321 per-capita expenditures in 2021 from carrier data (blue), right column scales §321 per-capita expenditure by zipcode median household income. Bottom panel: plots series against zipcodes' share of non-hispanic white households. Grey denotes the correlations using the 1w CBP sample. 5/95% error bands reported.

# §321 China Shares in DM Spending



Notes: both columns plots §321 share of expenditures on imports from China for 2021. 5/95% error bands reported.



# Road Map

- §321 Policy, Data and Descriptive Statistics
- **Framework**
- Moments and Estimation
- Policy Experiment

# Heterogeneous Consumers

- Heterogeneous consumer groups  $\omega$  with preferences over packages

- ▶ preferences on direct shipments  $x^\omega$ :

$$u^\omega = A^\omega (x^\omega)^{\frac{\kappa}{1+\kappa}} - P^\omega x^\omega + y^\omega$$

- ▶ CES ( $\gamma$ ) across origins:

$$x^\omega = \left( \sum_o (a^\omega)^{\frac{1}{\gamma}} (x_o^\omega)^{\frac{\gamma-1}{\gamma}} \right)^{\frac{\gamma}{\gamma-1}}$$

- ▶ CES ( $\sigma_o$ ) across varieties from  $o$ :

$$x_o^\omega = \left( \int_{i \in \Omega_o} (a_i^\omega)^{\frac{1}{\sigma_o}} (n_i^\omega)^{\frac{\sigma_o-1}{\sigma_o}} di \right)^{\frac{\sigma_o}{\sigma_o-1}}$$

★  $n_i^\omega$ : # packages of product  $i$  purchased by consumers in group  $\omega$

- Heterogeneity in  $\{A^\omega, a^\omega, a_i^\omega\}$  across groups  $\omega \rightarrow$  heterogeneous welfare impacts

# Firms

- From each  $o$ , firms are heterogeneous:
  - ▶ in unit cost  $z_i$
  - ▶ group-specific demand shock  $\{a_i^\omega\}$

- “Sophisticated” ( $S$ ) firms solve:

$$\max_v [(1 - \mathbf{1}_{v \geq v_{DM}} \tau_o) v - (z_i + \mathbf{1}_{v \geq v_{DM}} T)] D_i^\omega v^{-\sigma_o}$$

- ▶  $D_i^\omega$  are demand shifters
    - ★ function of price indexes, spending, and size of consumer groups
  - ▶ leads to bunching (next slide)
- “Naive” ( $N$ ) firms do not bunch
  - ▶ uses high-tariff pricing when low-tariff pricing puts it above  $v_{DM}$
  - ▶ deals with apparent lack of hole above the notch in the data (see below)

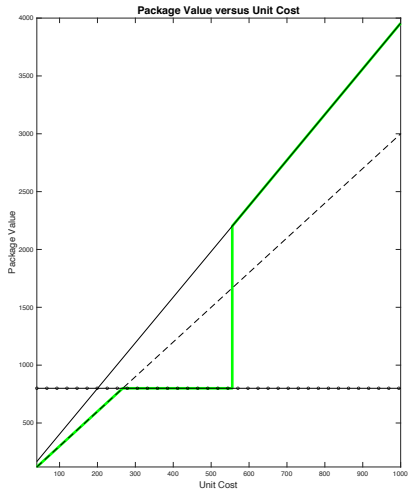
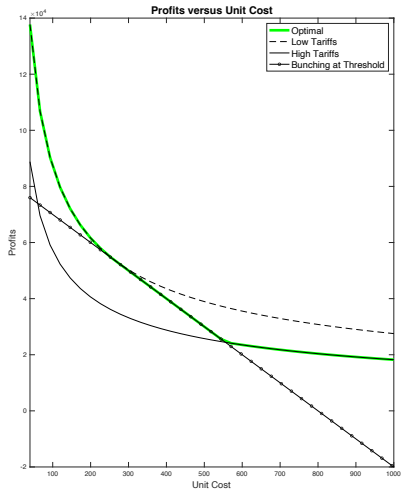
# Pricing

- Choice by “sophisticated” firms to send through §321 or not:
  - ▶ §321 shipments
    - ★ (below-threshold prices, no tariffs) → chosen by low unit cost firms
    - ★ (price at threshold, no tariffs) → chosen by intermediate cost (bunchers)
  - ▶ non-§321 shipments
    - ★ (high prices and high tariffs) → chosen by high unit cost firms
- Formally, optimal pricing is:

$$v_{o,s}(z) = \begin{cases} \frac{\sigma_o}{\sigma_o-1} z & z < \underline{z}_o \\ v_{DM} & \underline{z}_o \leq z < \bar{z}_o \\ \frac{\sigma_o}{\sigma_o-1} \frac{z + \tau_o}{1 - \tau_o} & \bar{z}_o \leq z \end{cases}$$

- ▶  $\underline{z}_o$  (lowest cost buncher) such that  $\frac{\sigma_o}{\sigma_o-1} \underline{z}_o = v_{DM}$
  - ▶ pricing jumps discretely at  $\bar{z}_o$  (highest cost buncher)
  - ▶ implies a “hole” in distribution of values on  $\left[ v_{DM}, \frac{\sigma_o}{\sigma_o-1} \frac{\bar{z}_o + \tau_o}{1 - \tau_o} \right]$
- NB: pricing/selection into §321 independent from demand shifters (due to CES)

# Formal versus Informal Tradeoff



# Measurement of Consumer Impacts

Suppose tariffs or DM threshold change:

- **Cost increase** over all direct shipments from origin  $o$  for group  $\omega$ :

$$\hat{P}_o^\omega = \left( \sum_{j=S,N} \int_z \lambda_{o,j}^\omega(z) \hat{v}_{o,j}(z)^{1-\sigma_o} dz \right)^{\frac{1}{1-\sigma_o}}$$

- ▶  $\hat{v}_{o,j}(z)$  is the price increase of firms with unit cost  $z$
- ▶  $\lambda_{o,j}^\omega(z)$  is the group- $\omega$  (pre-shock) import share in those firms
  - ★ depends on joint density over  $(z, a_o^\omega)$

- **Cost increase** of basket of direct shipments for group  $\omega$ :

$$\hat{P}^\omega = \left( \sum_o \lambda_o^\omega (\hat{P}_o^\omega)^{1-\gamma} \right)^{\frac{1}{1-\gamma}}$$

- ▶  $\lambda_o^\omega$  is (pre-shock) import share from  $o$  (among consumers  $\omega$ )

- **Welfare impact** in USD per consumer of group  $\omega$ :

$$\Delta u^\omega = \frac{(\hat{P}^\omega)^{-\kappa} - 1}{\kappa} e^\omega + \Delta tr^\omega$$

- ▶  $e^\omega$  is pre-shock expenditures in all direct shipments
- ▶  $\Delta tr^\omega$  is tariff revenue allocated to the group

# Parametrization Strategy

- Iterative procedure over  $\{\sigma_o, \lambda_{o,j}^\omega(z)\}$ 
  - ① Given  $\sigma_o$ , recover  $\lambda_{o,S}^\omega(z)$  and  $\lambda_{o,N}^\omega(z)$  from observed densities by consumer group in post-2016 period
    - ★ match fraction of “naive” firms to observed density of shipments within model-implied hole
  - ② Simulate shocks back to pre-period
    - ★ change de minimis threshold from \$800 to \$200
    - ★ change high trade-war tariffs to pre-period (low) tariffs
  - ③ Calibrate  $\sigma_o$  to match observed relative change in package density between \$200 and \$800 due to bunching
- $\gamma$  and  $\kappa$  reflected in associated changes in import shares
  - ▶ for now, calibrated to Fagelbaum et al (2020)
  - ▶ future versions: tariffs across origins can recover  $\gamma$ , and direct shipments over imports recover  $\kappa$

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# Impacts of §321 thresholds

- Observe the density of §321 shipments relative to two controls
  - ▶  $\implies$  changes in the density when the threshold changes from \$200 to \$800
  - ▶ pre vs post
  - ▶ shipments to US vs shipments to OECD

- In levels

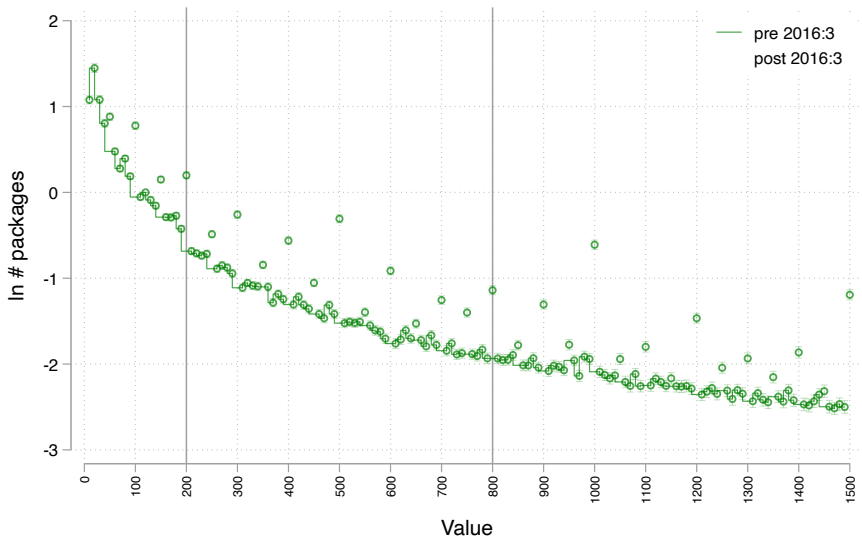
$$\ln c_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

- ▶  $b$ : \$10 bin
  - ▶  $o$ : origin
  - ▶  $d$ : destination (US vs OECD)
  - ▶  $x$ : carrier (A,B,C)
  - ▶  $t$ : month
  - ▶ fixed effects:  $\alpha_{xt}$  and  $\alpha_o$
  - ▶ leave-out bin: \$120
- plot the bin FEs  $\beta_b$  to show the density of shipments

# USA Shipment Density: Pre-Period

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==1 & post==0

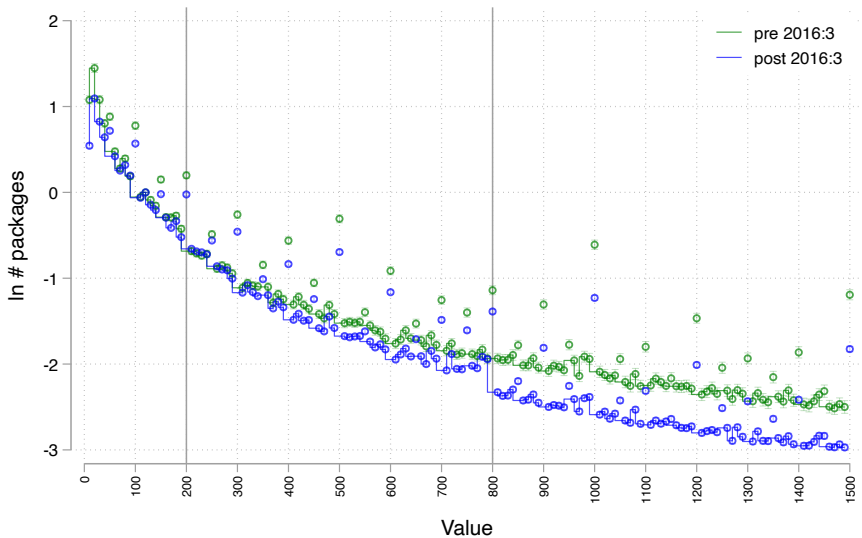


normalized to # packages at \$120

# USA Shipment Density: Post Period

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==1 & post==1

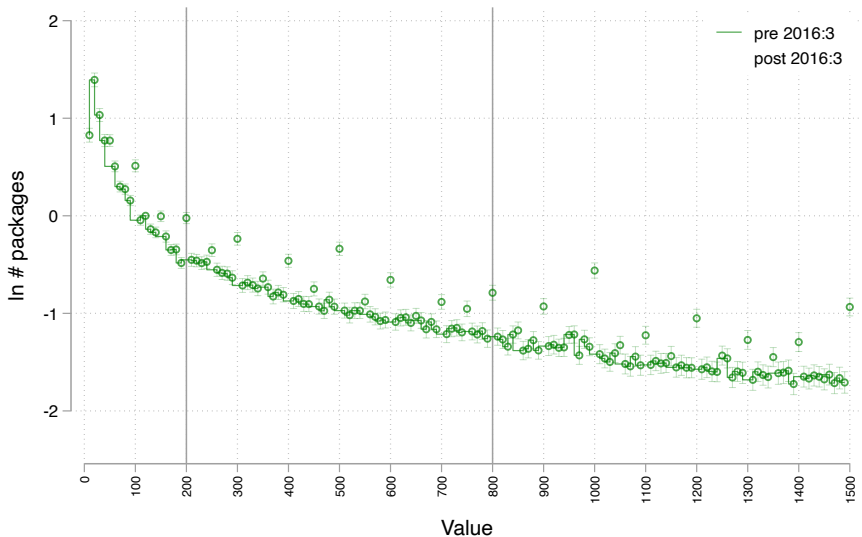


normalized to # packages at \$120

# OECD Shipment Density: Pre Period

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==0 & post==0

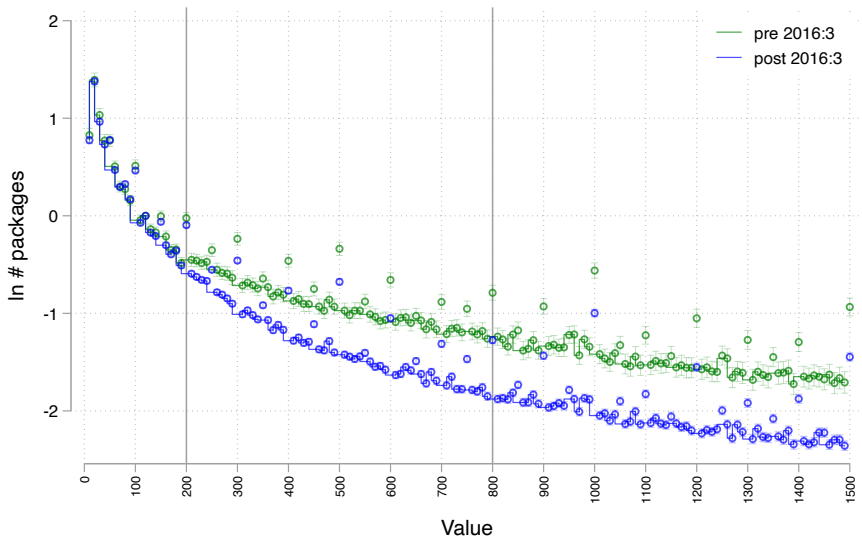


normalized to # packages at \$120

# OECD Shipment Density: Post Period

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==0 & post==1



normalized to # packages at \$120

# $\Delta$ Density: USA vs OECD in Post

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times \text{USA}_d + \epsilon_{bodxt}$$

if post==1

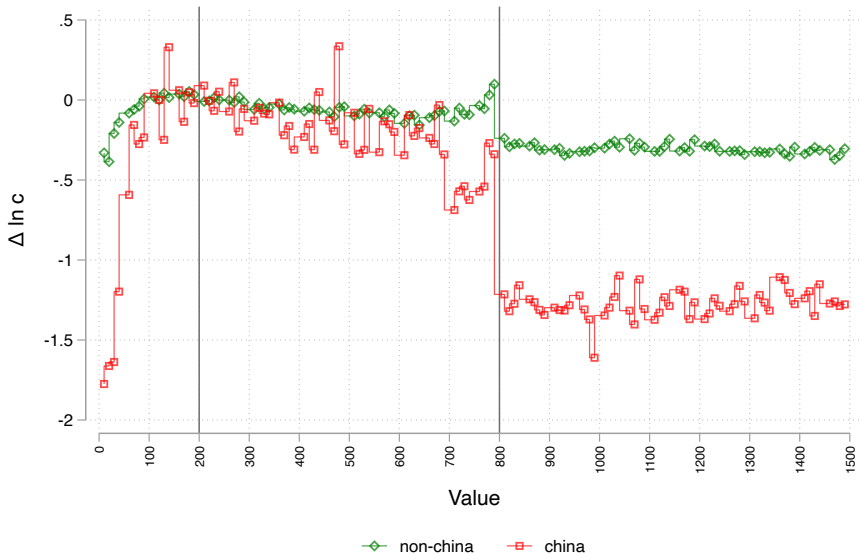


normalized to  $\Delta \#$  packages at \$120

# $\Delta$ Density: USA vs OECD in Post, By Origin

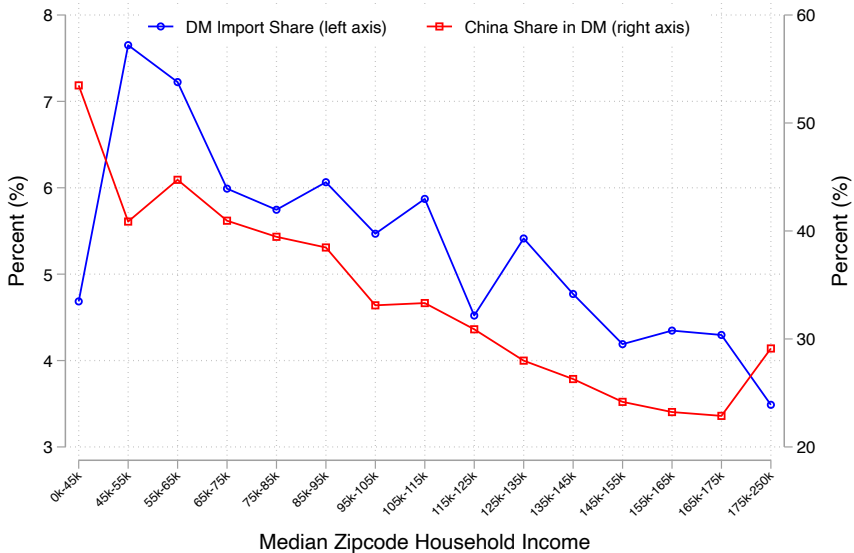
$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times \text{USA}_d + \epsilon_{bodxt}$$

if post==1



# DM Share of Shipments, and China Share of DM

Zipcodes' §321 expenditures divided by direct shipments & §321 import share from China





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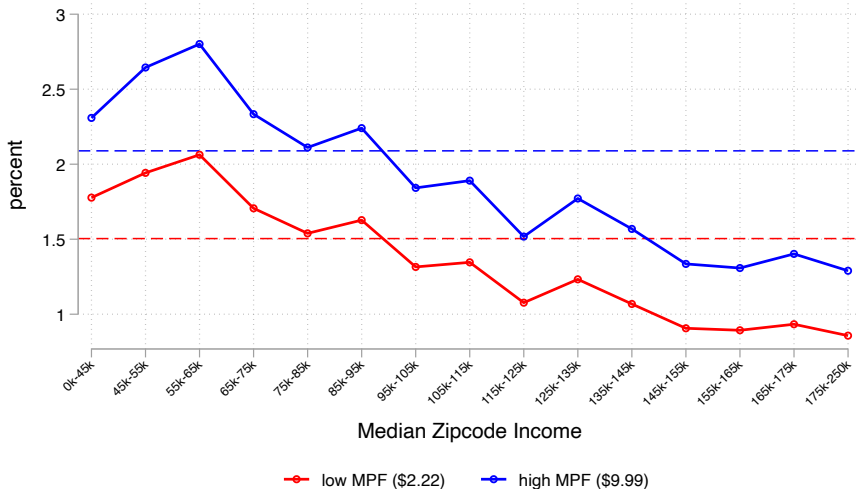
# Policy Experiment

- Eliminate §321 from current equilibrium, so shipments below \$800:
  - ▶ subject to tariffs
  - ▶ subject to per-shipment “merchandise processing fee” of \$2.22 or \$9.99 (current fee for informal shipments, \$801-\$2500)
- Two origins: China and non-China
  - ▶ processing fee paid on imports from both origins
  - ▶ tariffs on China imports: 24.0%
  - ▶ tariffs on Non-China imports: 1.6%
- Procedure finds:
  - ▶ low fee case:  $\sigma_{chn} = 4.30$ ,  $\sigma_{non-chn} = 3.42$
  - ▶ high fee case:  $\sigma_{chn} = 4.22$ ,  $\sigma_{non-chn} = 4.90$ 
    - ★ set  $\gamma = 2.53$  Fajgelbaum et al. 2020
- Examine impacts across zipcode median income, % white household share

# Price Index Increase from Removing §321

change in price index for basket of direct shipments

% change in prices

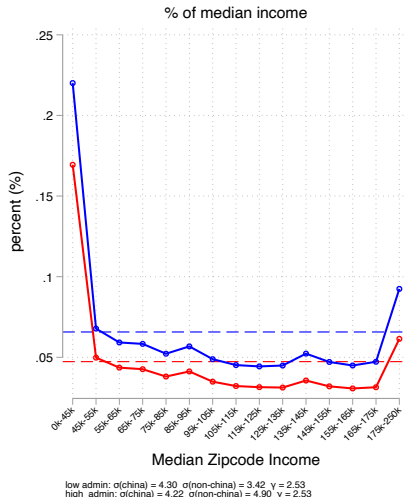
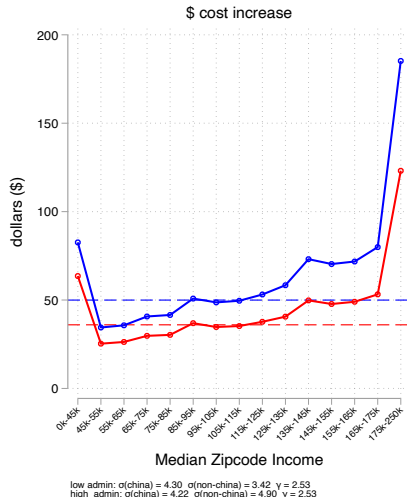


low admin:  $\sigma(\text{china}) = 4.30$   $\sigma(\text{non-china}) = 3.42$   $\gamma = 2.53$   
high admin:  $\sigma(\text{china}) = 4.22$   $\sigma(\text{non-china}) = 4.90$   $\gamma = 2.53$

Horizontal dash lines denote price index change for the representative consumer. "MPF" is merchandise processing fee.

# Dollar Cost Increase from Removing §321

increase in cost of direct shipments (change price index  $\times$  amount spent)



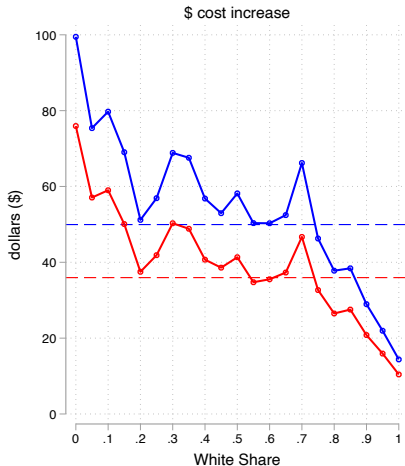
—●— low MPF (\$2.22)

—●— high MPF (\$9.99)

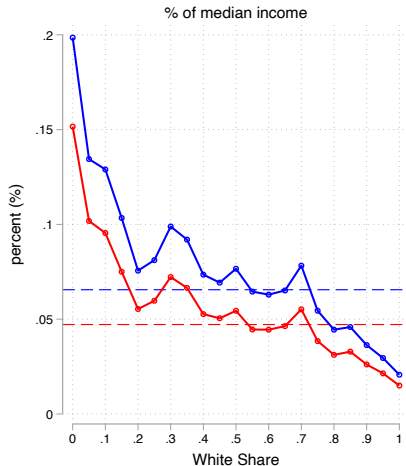
Horizontal dash lines denote dollar cost changes for the representative consumer. "MPF" is merchandise processing fee.

# Dollar Cost Increase from Removing §321

increase in cost of direct shipments (change price index  $\times$  amount spent)



low admin:  $\sigma(\text{china}) = 4.30$   $\sigma(\text{non-china}) = 3.42$   $\gamma = 2.53$   
high admin:  $\sigma(\text{china}) = 4.22$   $\sigma(\text{non-china}) = 4.90$   $\gamma = 2.53$



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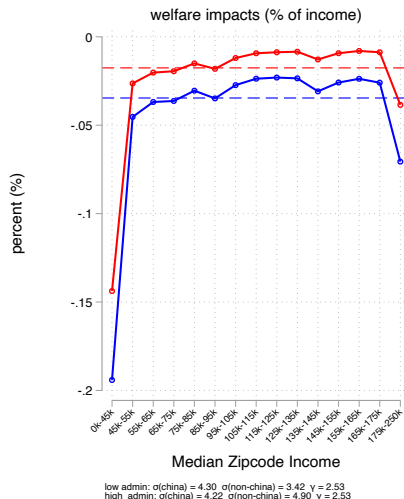
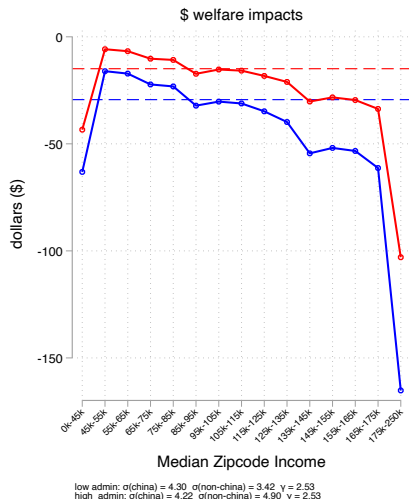
—○— low MPF (\$2.22)

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# Welfare Impacts from Removing §321

includes tariff revenues equally rebated to consumers



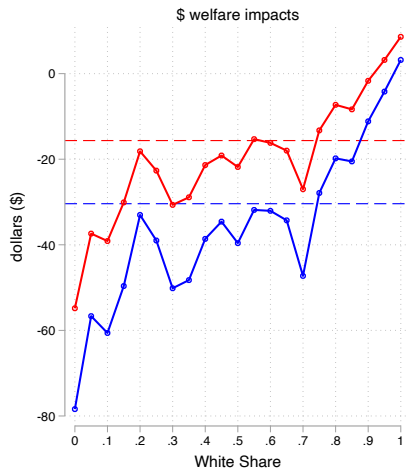
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—●— high MPF (\$9.99)

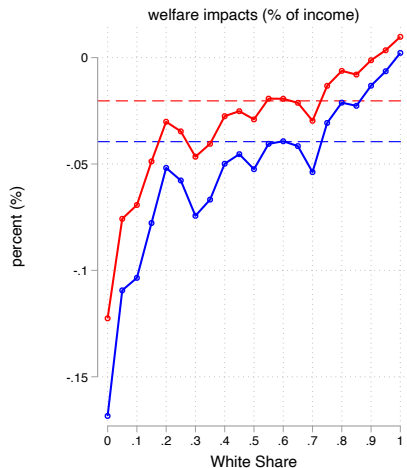
Horizontal dash lines is the welfare impact for the representative consumer (negative value means a loss).

# Welfare Impacts from Removing §321

includes tariff revenues equally rebated to consumers



low admin:  $\sigma(\text{china}) = 4.30$   $\sigma(\text{non-china}) = 3.42$   $\gamma = 2.53$   
high admin:  $\sigma(\text{china}) = 4.22$   $\sigma(\text{non-china}) = 4.90$   $\gamma = 2.53$



low admin:  $\sigma(\text{china}) = 4.30$   $\sigma(\text{non-china}) = 3.42$   $\gamma = 2.53$   
high admin:  $\sigma(\text{china}) = 4.22$   $\sigma(\text{non-china}) = 4.90$   $\gamma = 2.53$

—○— low MPF (\$2.22)

—○— high MPF (\$9.99)

Horizontal dash lines is the welfare impact for the representative consumer (negative value means a loss).

# Preliminary Conclusions

- Eliminating §321 raises consumers' costs of buying a basket of direct shipments:
  - ▶ by \$36.0/yr from §321 in low fee case
  - ▶ by \$50.0/yr from §321 in high fee case
  - ▶ tariff revenue gain does not offset consumer loss
- Unequal impacts of §321:
  - ▶ zips at the lowest and highest median income gain more from §321 than middle-income zips
  - ▶ ...as do zips with higher shares of non-white households
- Future versions will examine distributional consequences §321 on additional zipcode demographics, and consider impacts on US producers

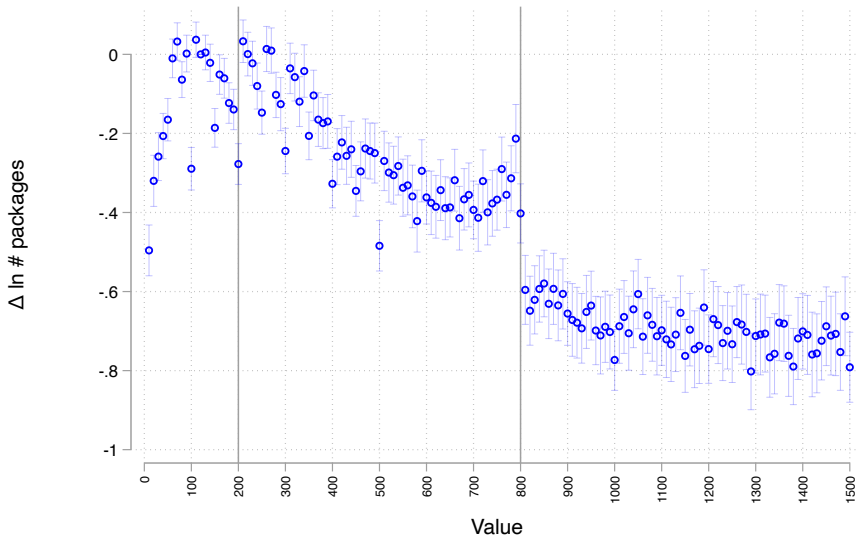


# Appendix Slides

# $\Delta$ Density: Post vs Pre (Households Points)

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times post_b + \epsilon_{bodxt}$$

if USA==1 & household==1

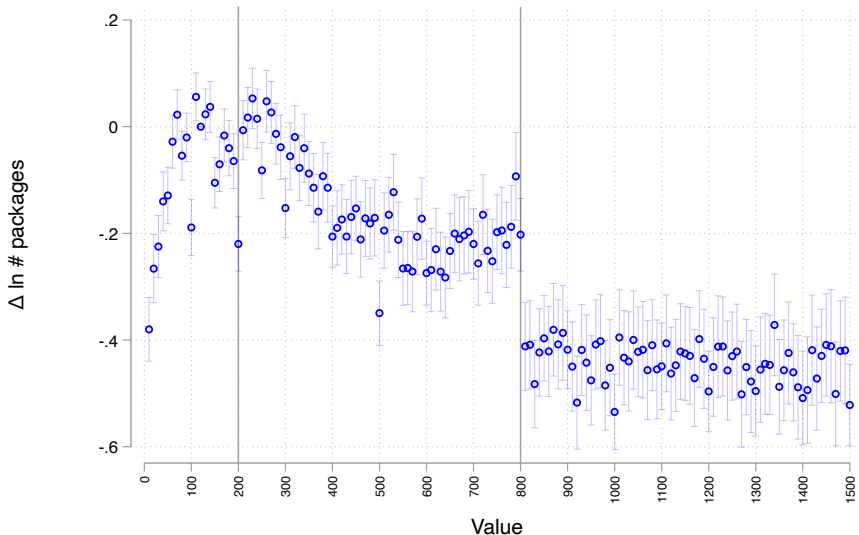


normalized to  $\Delta \#$  packages at \$120

# $\Delta$ Density: Post vs Pre (Commercial Points)

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times post_b + \epsilon_{bodxt}$$

if USA==1 & commercial==1

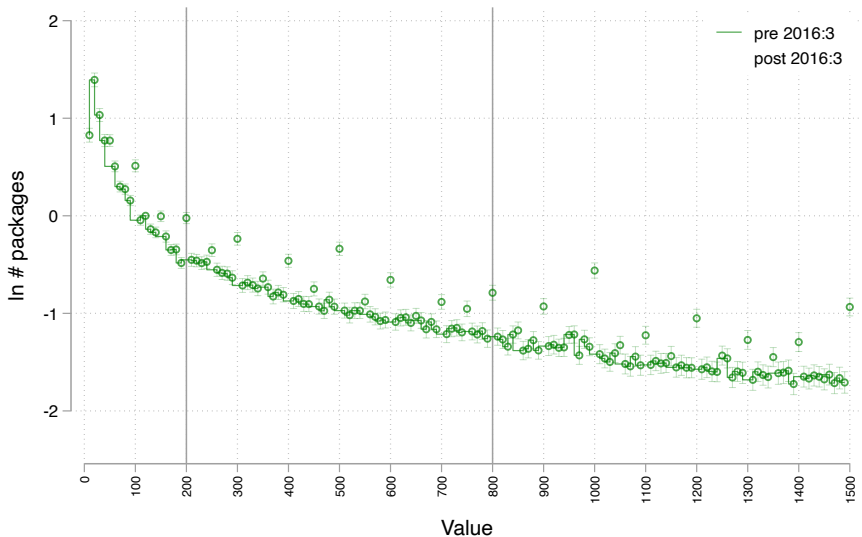


normalized to  $\Delta \#$  packages at \$120

# OECD Shipment Density: Before March 2016

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==0 & post==0

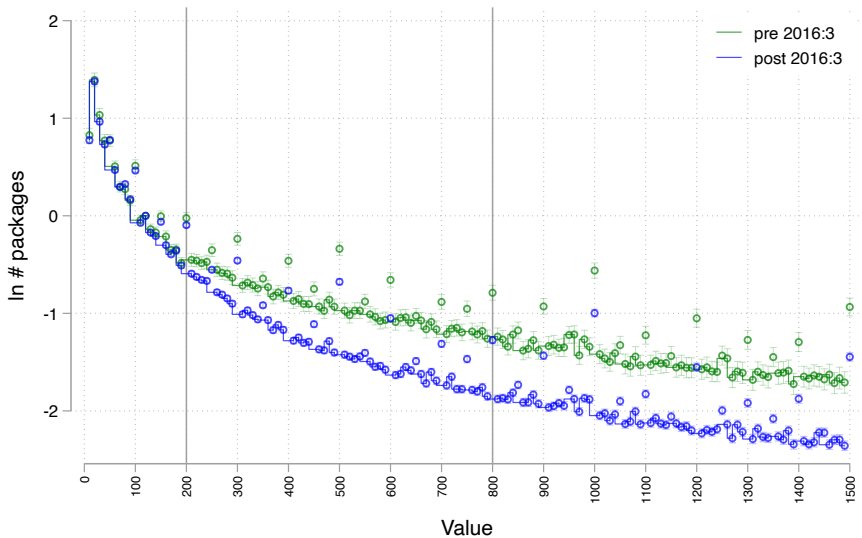


normalized to # packages at \$120

# OECD Shipment Density: After March 2016

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b + \epsilon_{bodxt}$$

if USA==0 & post==1



normalized to # packages at \$120

# $\Delta$ Density: USA vs OECD in Pre

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times \text{USA}_d + \epsilon_{bodxt}$$

if post==0



normalized to  $\Delta \#$  packages at \$120

# $\Delta$ Density: USA vs OECD in Post

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times \text{USA}_d + \epsilon_{bodxt}$$

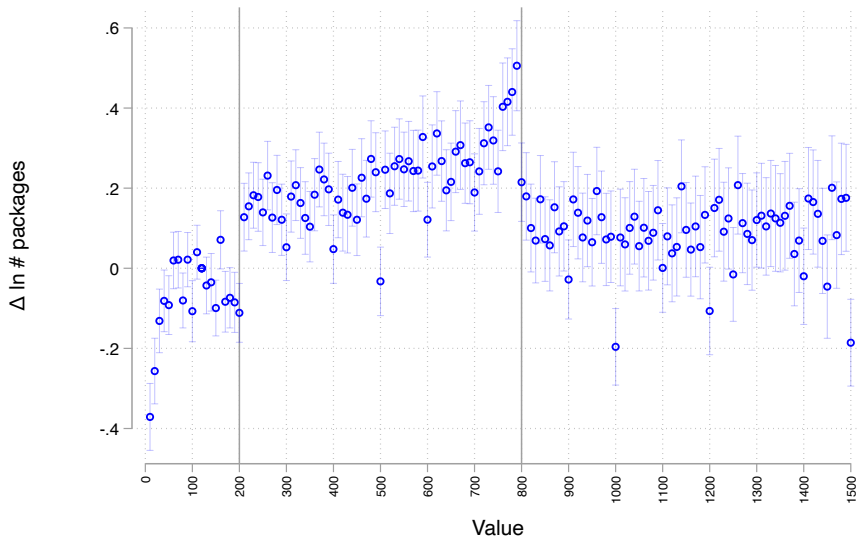
if post==1



normalized to  $\Delta \#$  packages at \$120

# Difference in Differences (USA vs OECD) vs (Post vs Pre)

$$\ln C_{bodxt} = \alpha_{xt} + \alpha_o + \alpha_{dt} + \beta_b \times post_b \times USA_d + \epsilon_{bodxt}$$



normalized to Δ # packages at \$120



# CBP Sample

$$\ln c_{bot} = \alpha_o + \alpha_t + \beta_b + \epsilon_{bot}$$

