

# What Can Stockouts Tell Us About Inflation? Evidence from Online Micro Data

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## What we do

- Create two high-frequency measures of **consumer product shortages** in 7 countries
  - temporary stockouts, discontinued products
- Are shortages associated with inflation?
- Are the inflation effects stronger for imported goods?
- What do observed prices and shortages imply about the cost to replenish inventories?

## Micro data on price and stockouts

- Data scraped from websites of **large multi-channel retailers** that sell mostly offline
- We focus on 70 retailers in 7 countries that show “out of stock” information

	Products	Retailers	Coverage of All CPI Weights, (%)	Coverage of Goods CPI Weights, (%)
Canada	194,151	11	27	80
China	49,685	3	38	76
France	372,962	11	32	63
Germany	297,320	13	27	52
Japan	95,313	7	30	68
Spain	171,400	8	31	56
USA	777,554	17	21	62
All	1,958,385	70	29	65

- **Sectors:** Food & Beverages, Furnishings & Household, Health, Electronics, Other goods
- **Not included:** Alcohol & Tobacco, Apparel, Cars, Gasoline

# Measuring shortages in retail (sector $j$ , country $c$ , date $t$ )

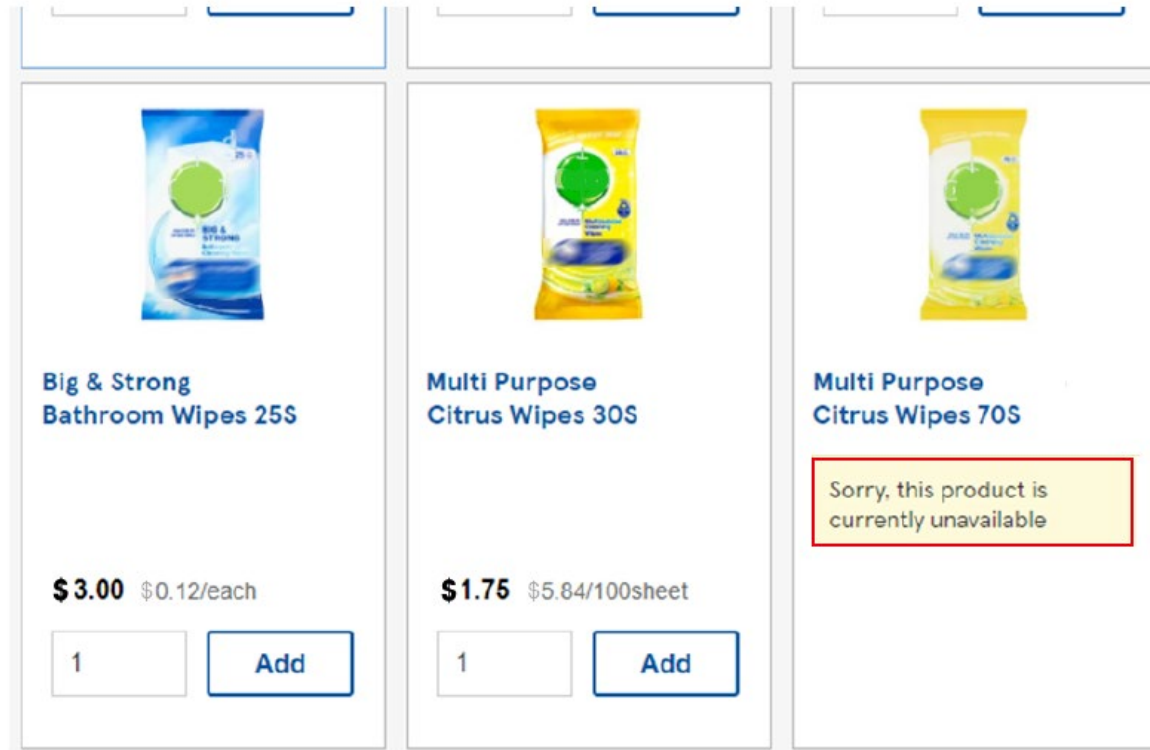


Figure 1: Identifying Stockouts on a Retailer's Website

- Temporary Stockouts ( $TOOS_{j,c,t}$ ) =  $\frac{\# \text{ out of stock}_{j,c,t}}{\# \text{ total products}_{j,c,t}}$

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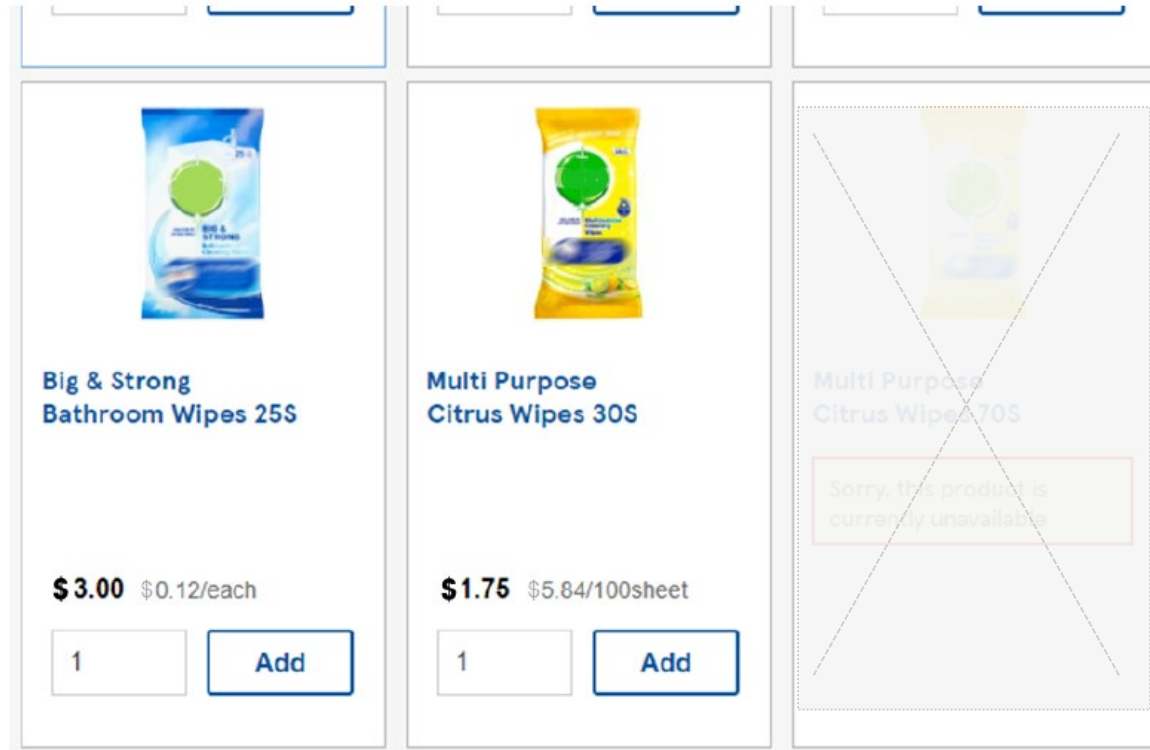


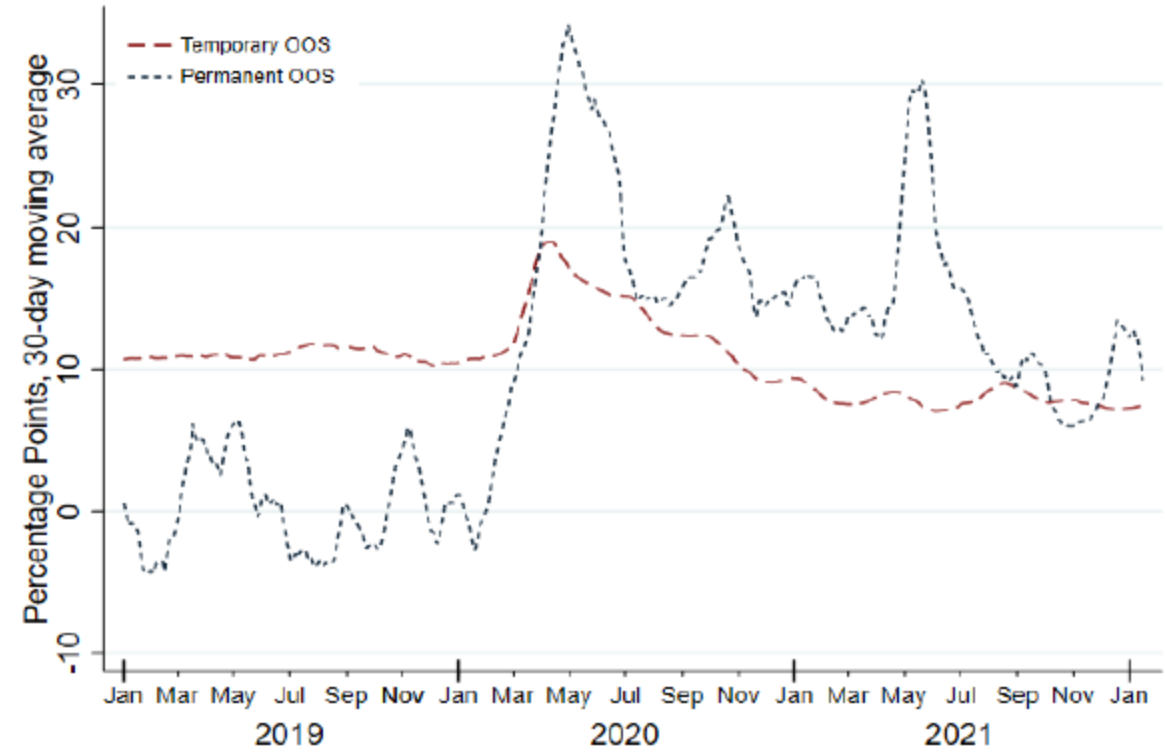
Figure 1: Identifying Stockouts on a Retailer's Website

- Temporary Stockouts ( $TOOS_{jc,t}$ ) =  $\frac{\# \text{ out of stock }_{jc,t}}{\# \text{ total products }_{jc,t}}$
- Permanent Stockouts ( $POOS_{jc,t}$ ) =  $1 - \frac{\# \text{ total products }_{jc,t}}{\# \text{ total products }_{jc, \text{Jan}-2020}}$

# Stockout dynamics in the United States

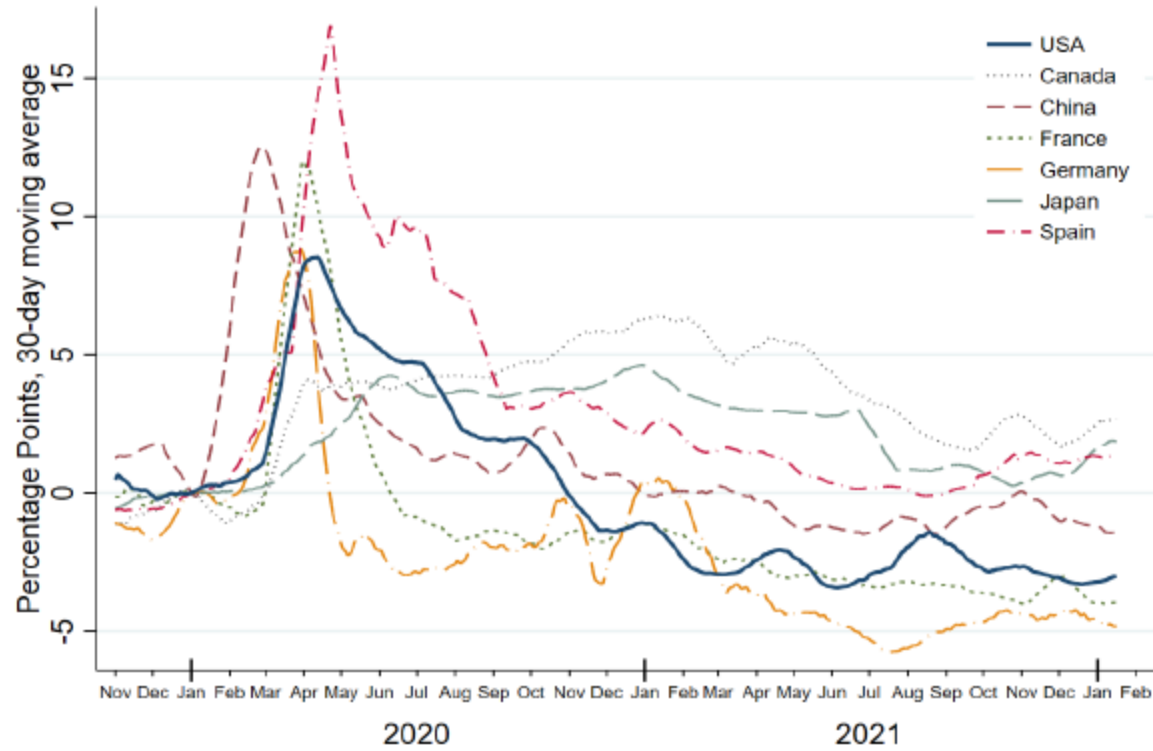


(a) All Stockouts

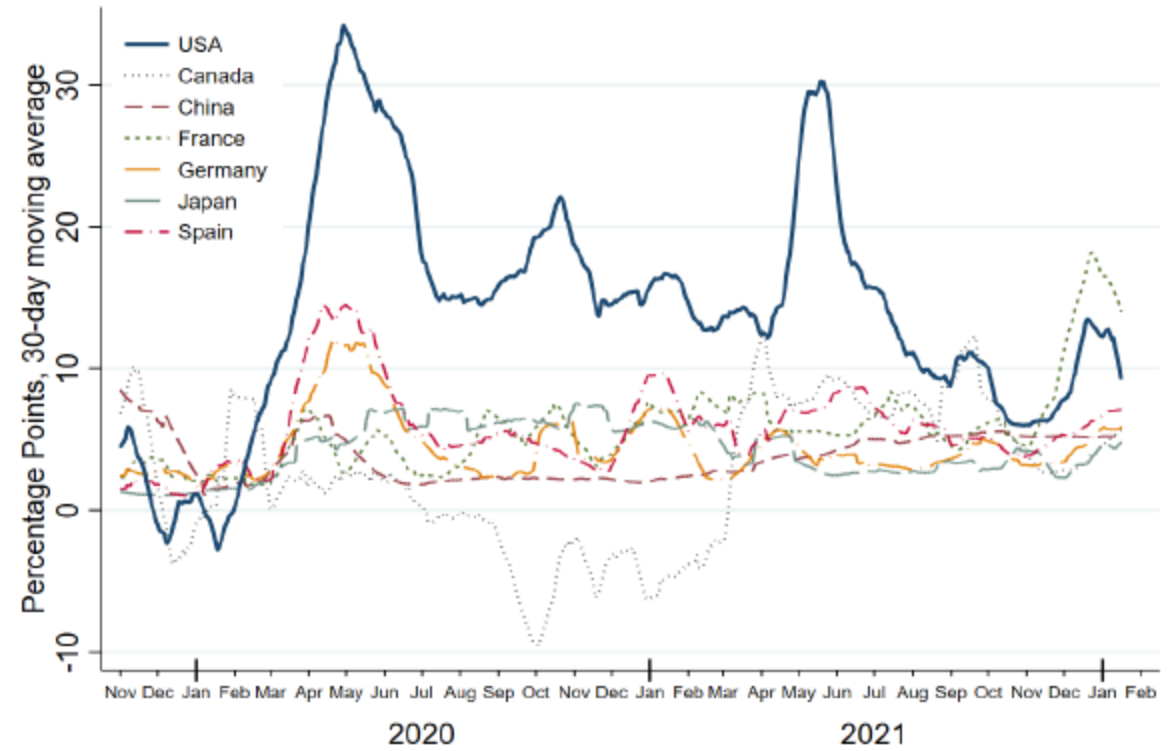


(b) Temporary and Permanent Stockouts

# Stockout dynamics in 7 countries

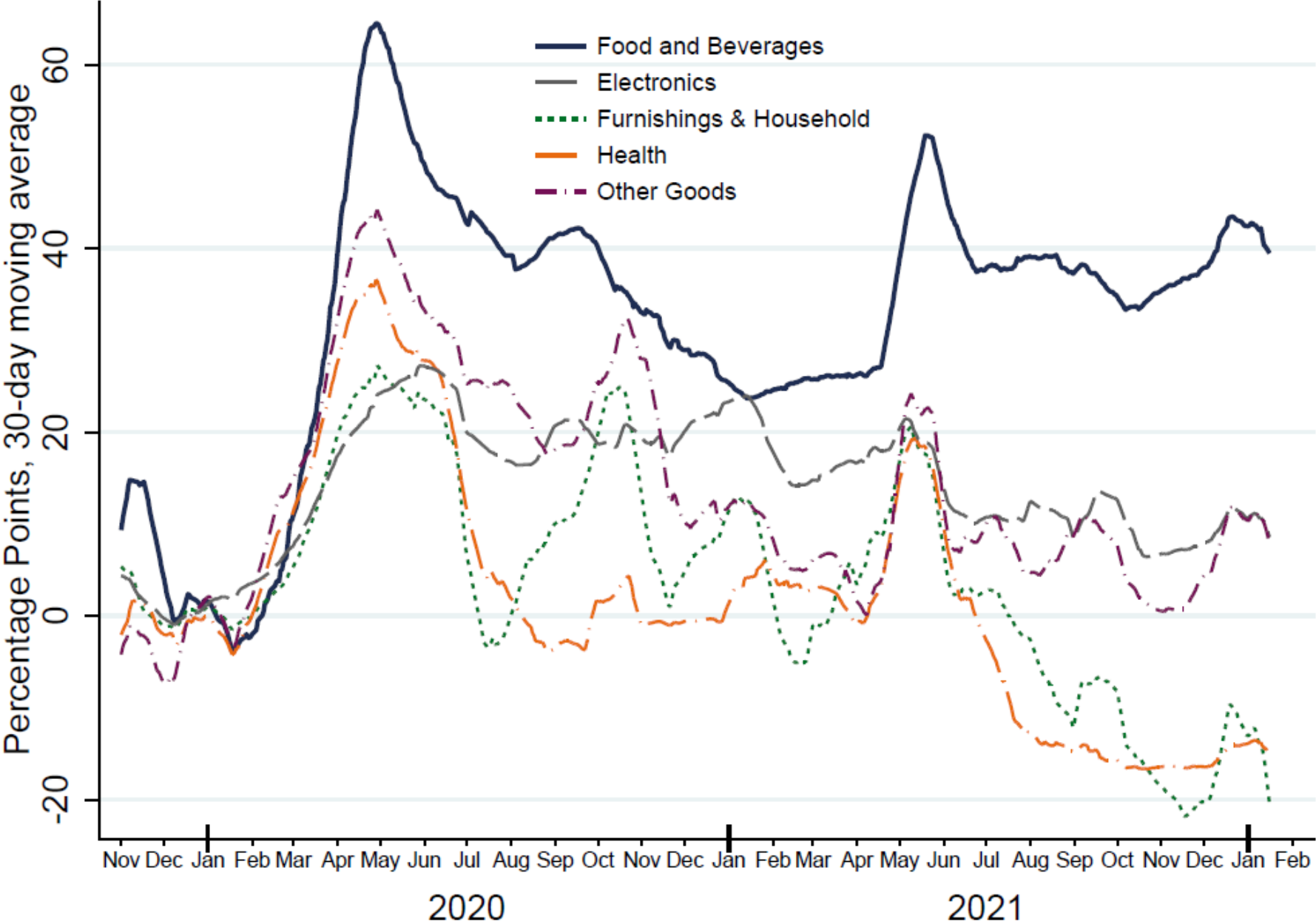


(a) Temporary Stockouts



(b) Permanent Stockouts

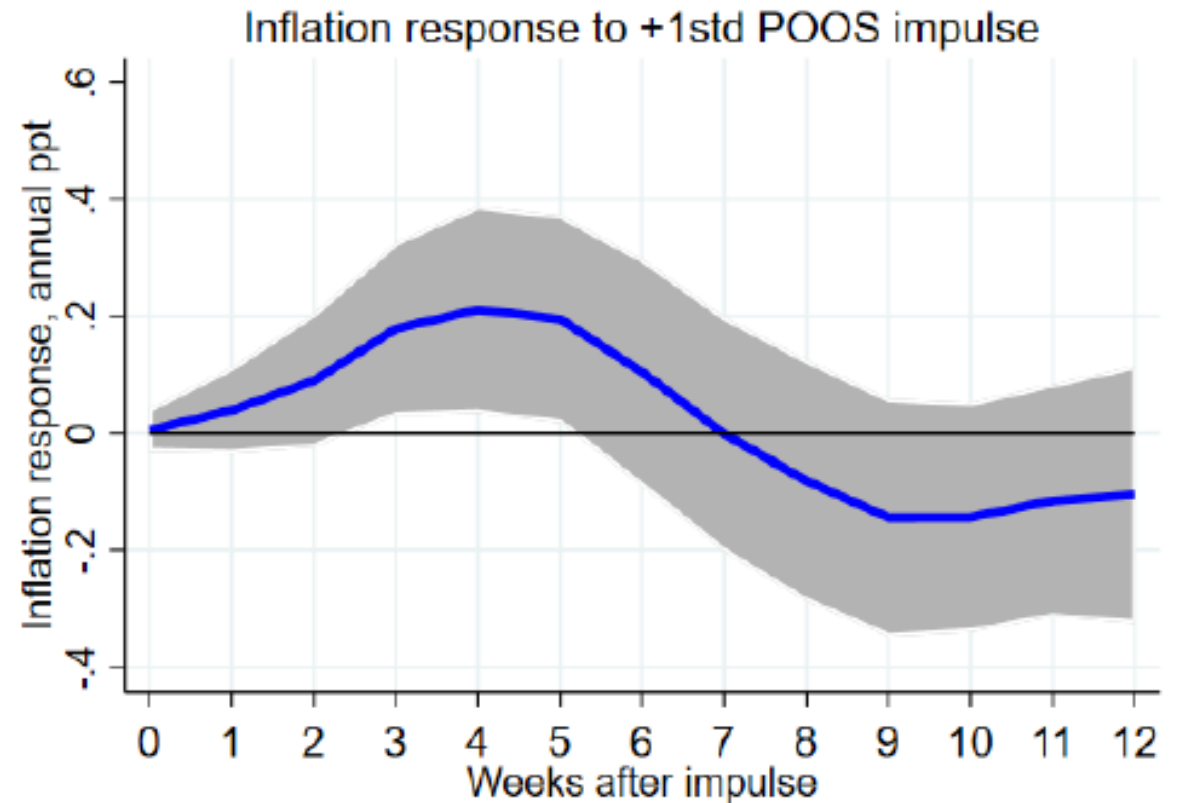
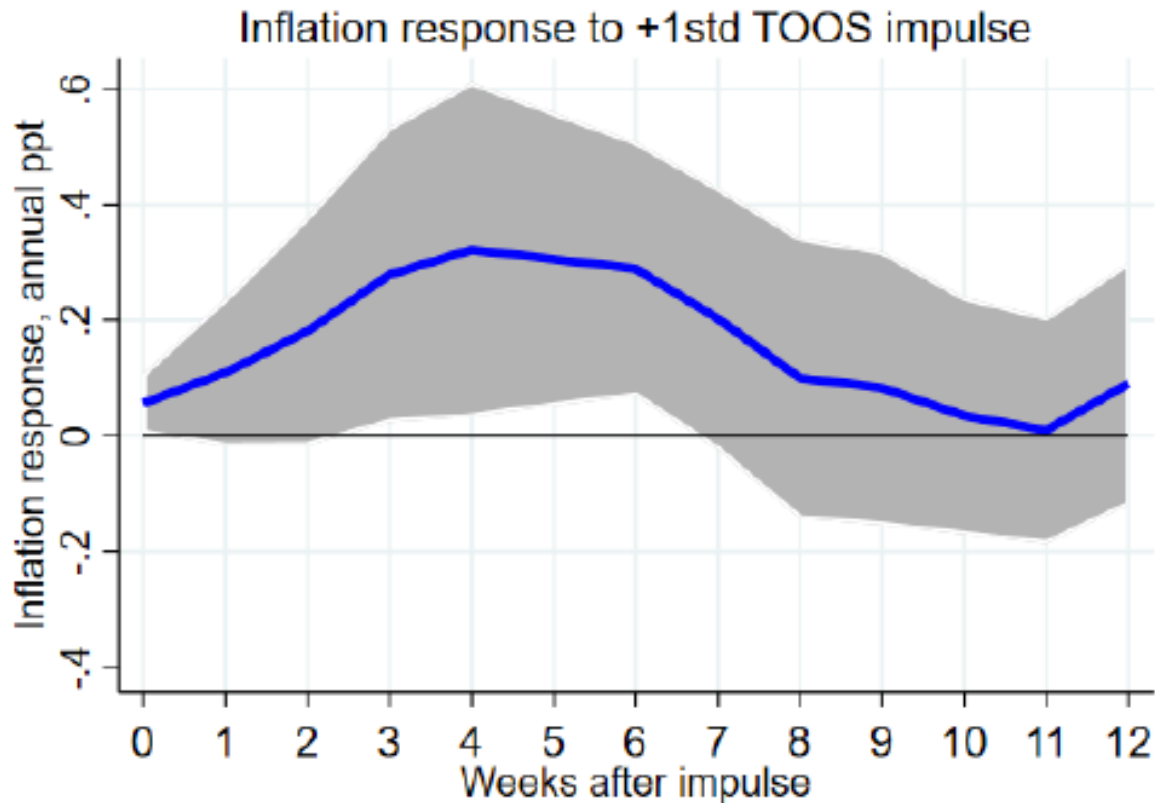
# In the United States, stockouts are more persistent in Food & Beverages





## Result 1: Shortages are associated with rising sector prices within 1-2 months

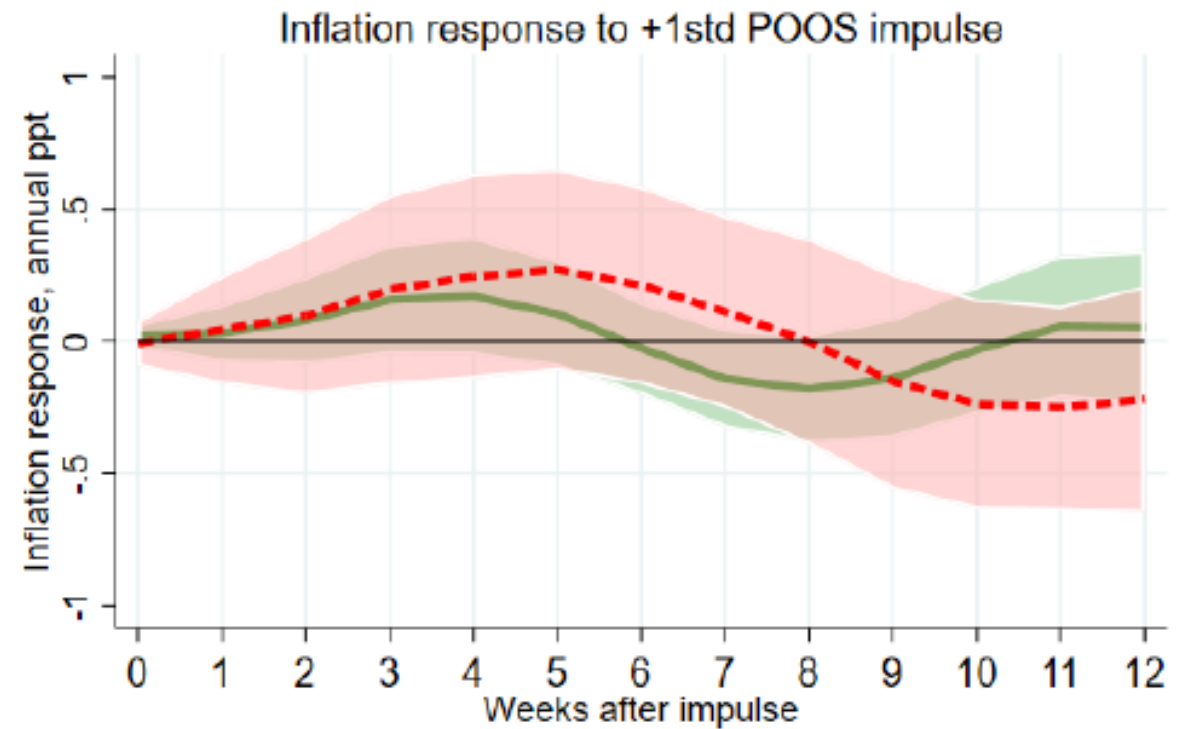
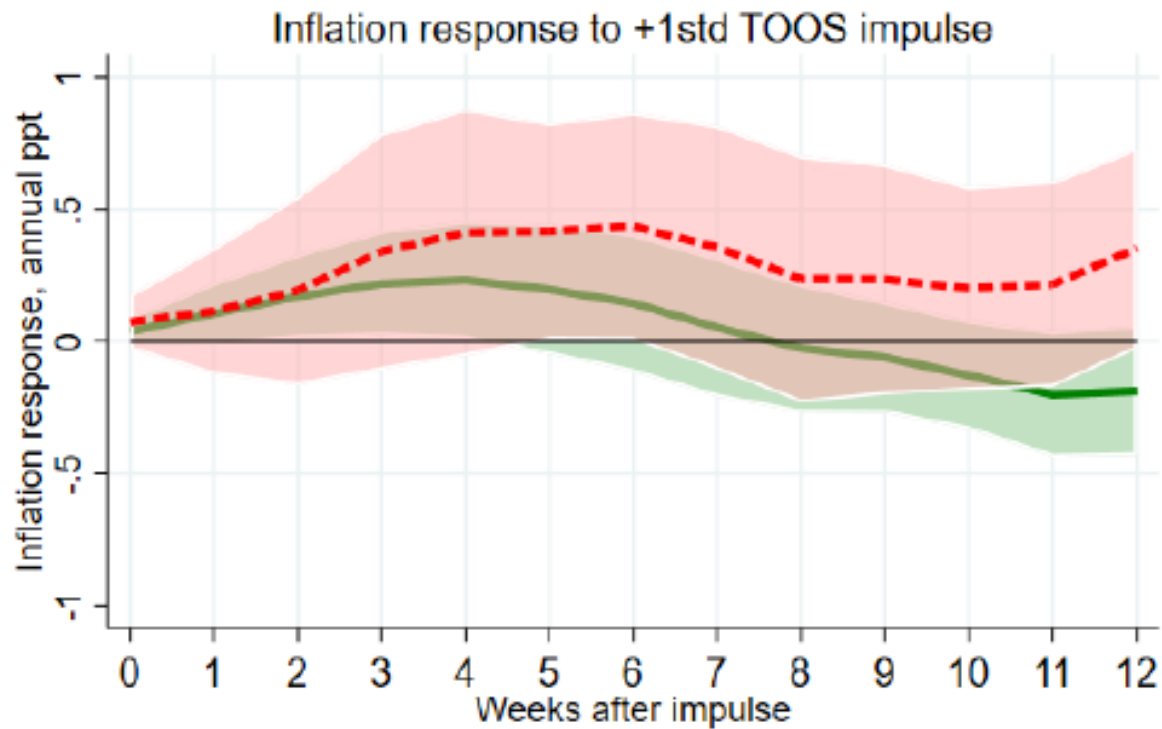
- Estimate the response of inflation to an exogenous stockout disturbance at the 3-digit level



- Doubling stockouts from 10% to 20% increases sector inflation by 1.6 ppt (annualized rate)

## Result 2a: Inflation response is larger & longer in import intensive sectors

- Split 235 sectors (7 countries) into groups below/above weighted median import share (0.24)
  - **Low shares:** China, Japan, USA; unprocessed food, plants, printed material
  - **High shares:** Canada, Germany; video/audio equipment, furniture, jewelry and watches

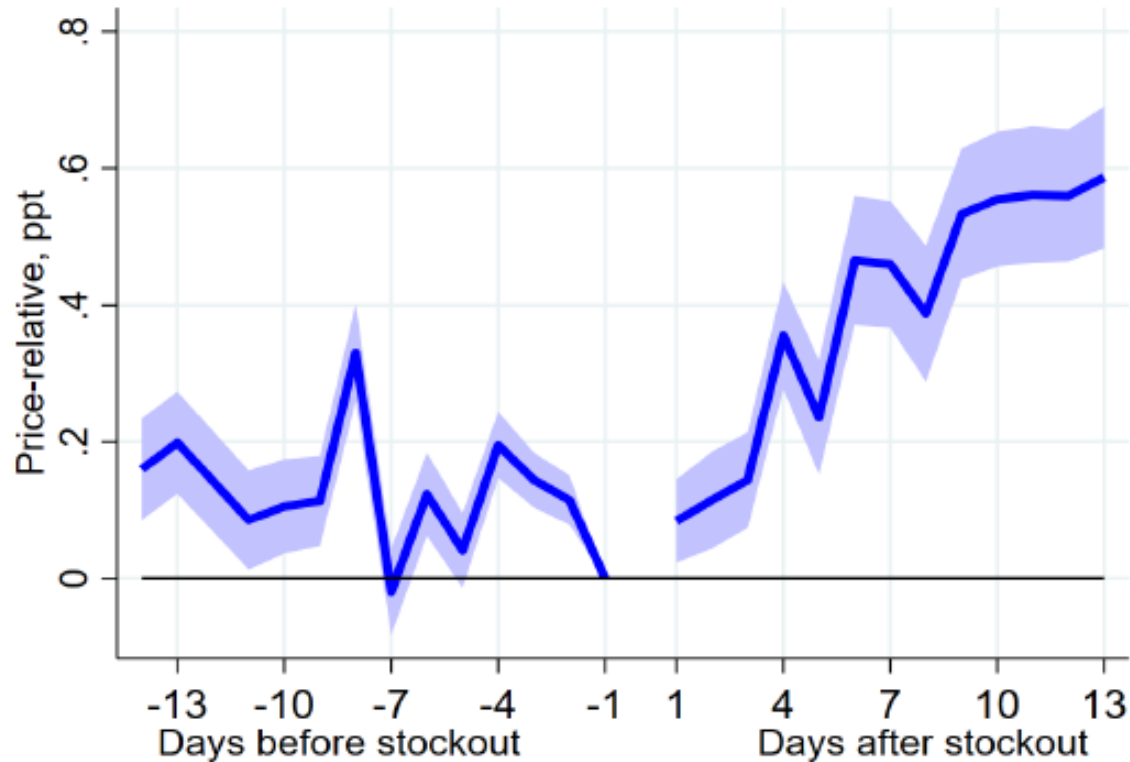


— Low import share

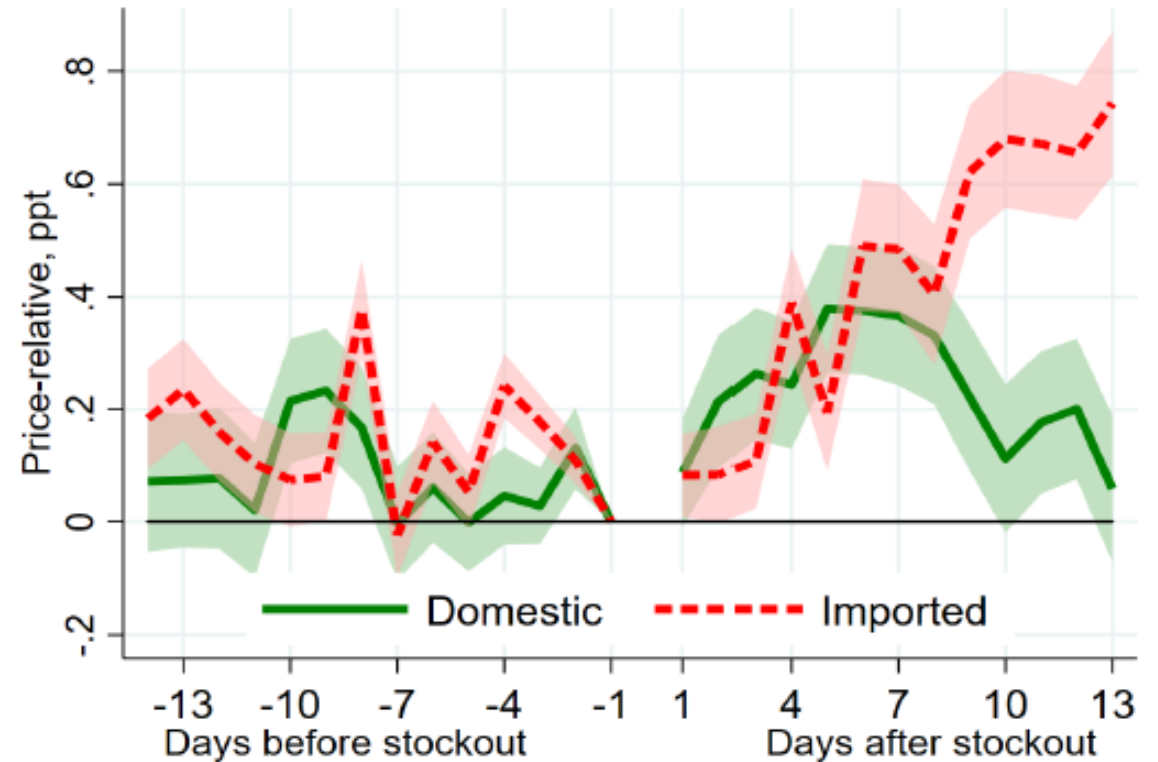
- - - High import share

## Result 2b: After stockouts prices tend to rise, especially for imported goods

- Micro evidence from a large U.S. retailer



(a) All price changes



(b) Domestic versus Imported Goods

**Price-relative** = cum log p-change  $t$  days before/after day -1 relative to cum log price change for all goods in sector

# What can stockouts tell us about the cost of replenishing inventories?

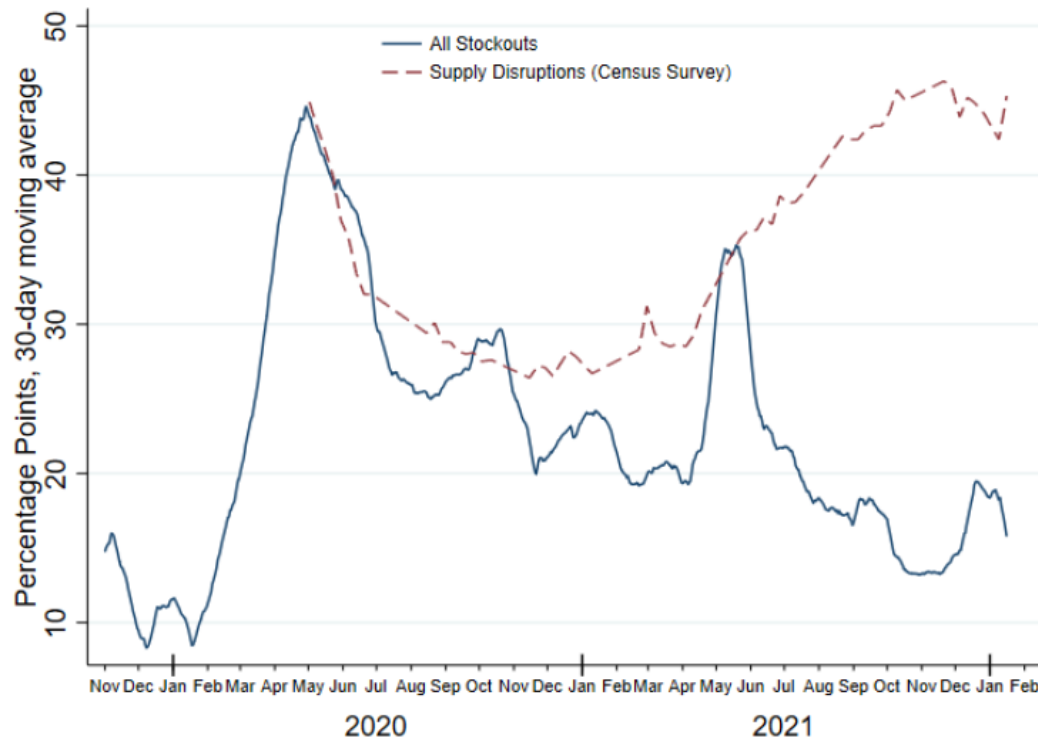
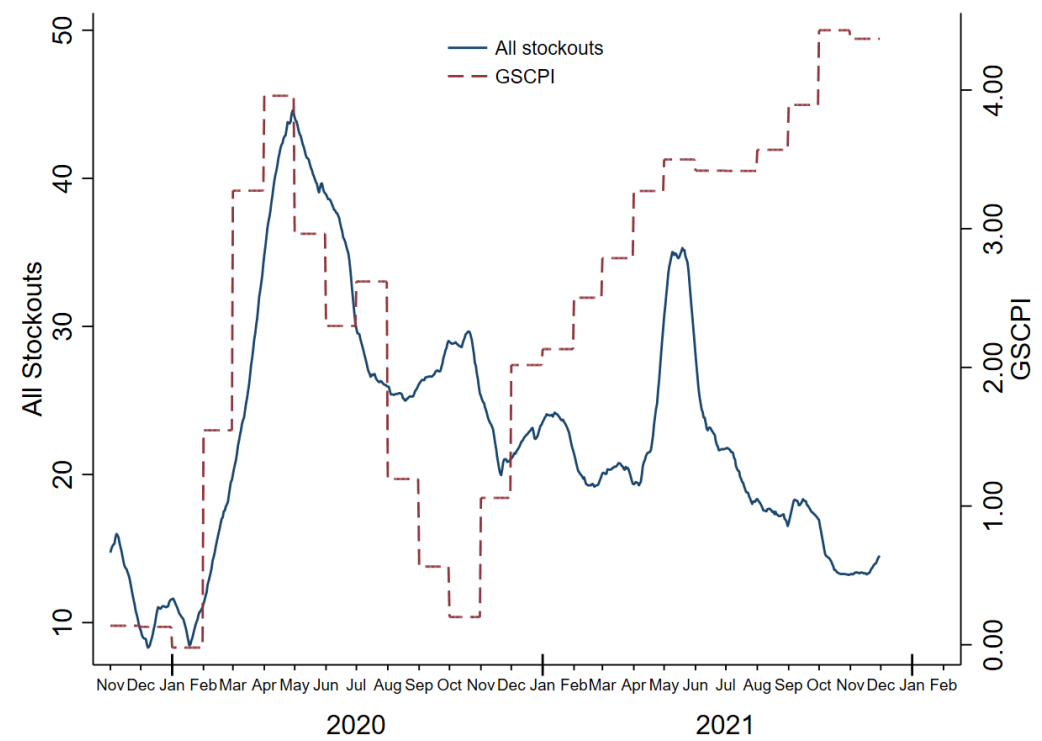


Figure A1: Stockouts (AOOS) vs. U.S. Census Survey of Small Business Disruptions

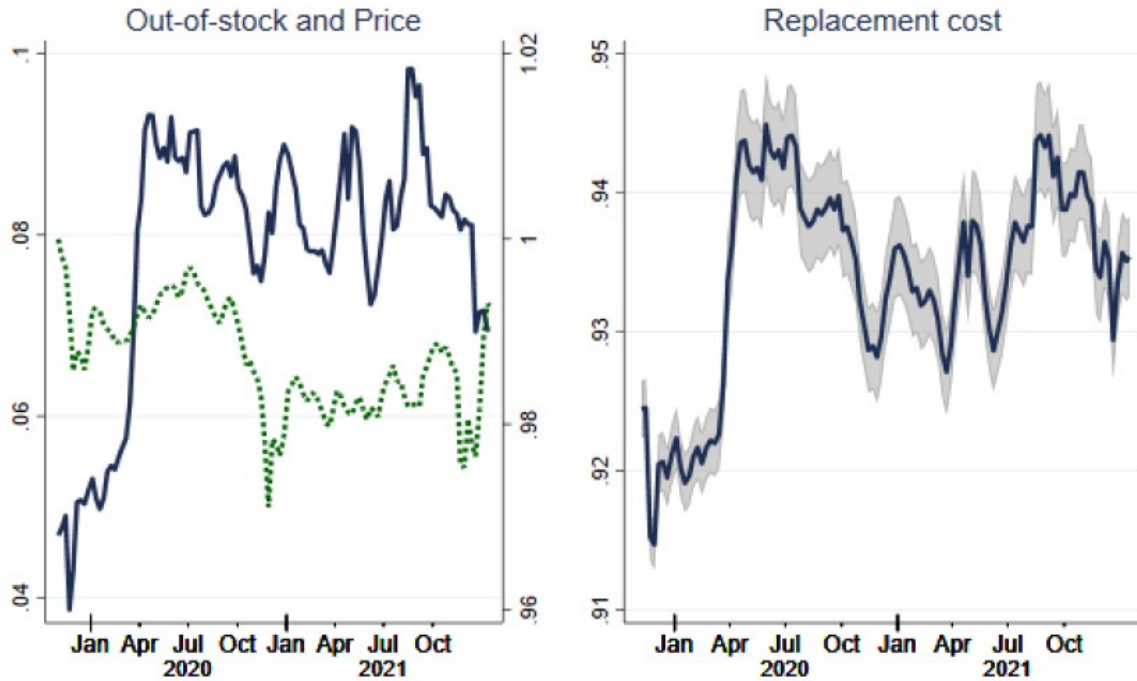


Source: Benigno et al. (2022), index of global supply chain pressures

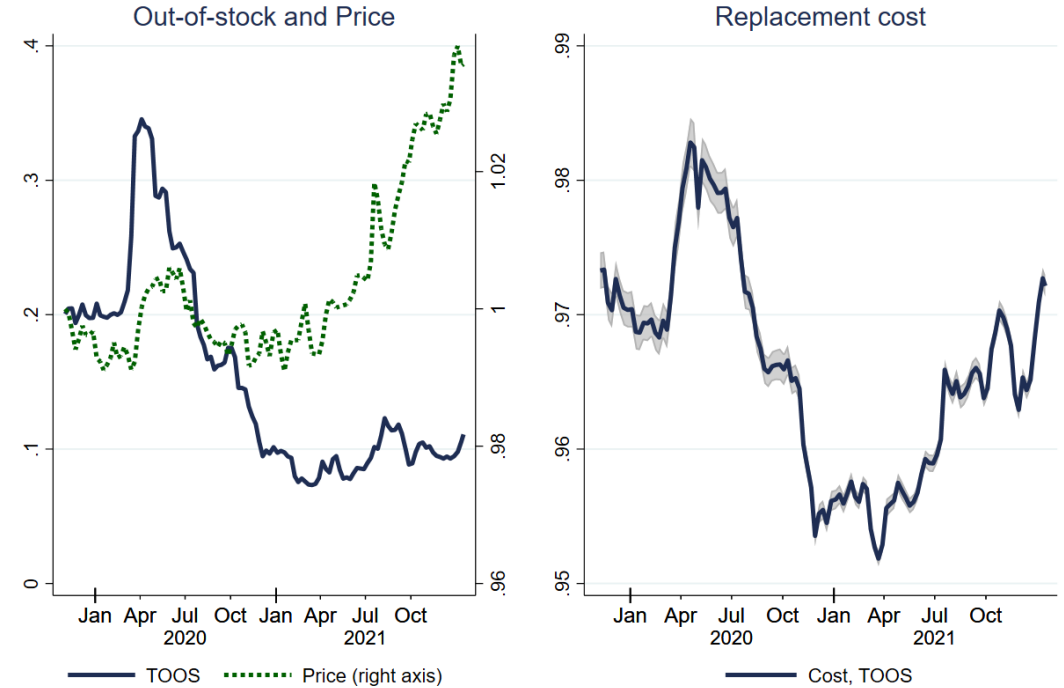
- Our stockouts matched surveys of “supply disruptions” closely until May 2021, but have diverged since
- Firms can adjust to changes in the replacement cost via stockouts and prices → we cannot infer the cost only from stockout dynamics
- We use a model to endogenize inventory decisions, and estimate cost based on observable OOS and prices

# Use observed OOS and prices to estimate the cost of replenishing inventories

## Electronics, USA

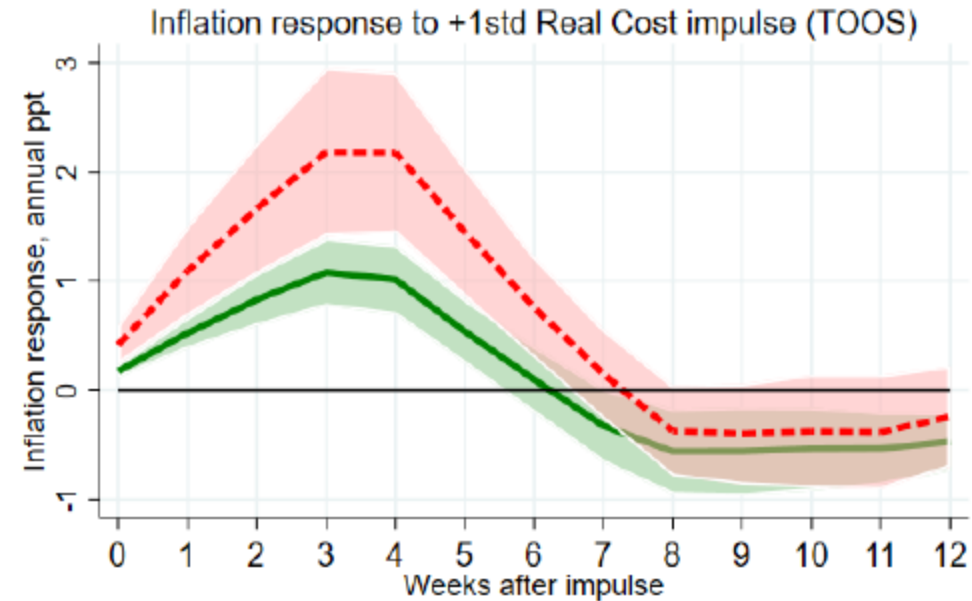
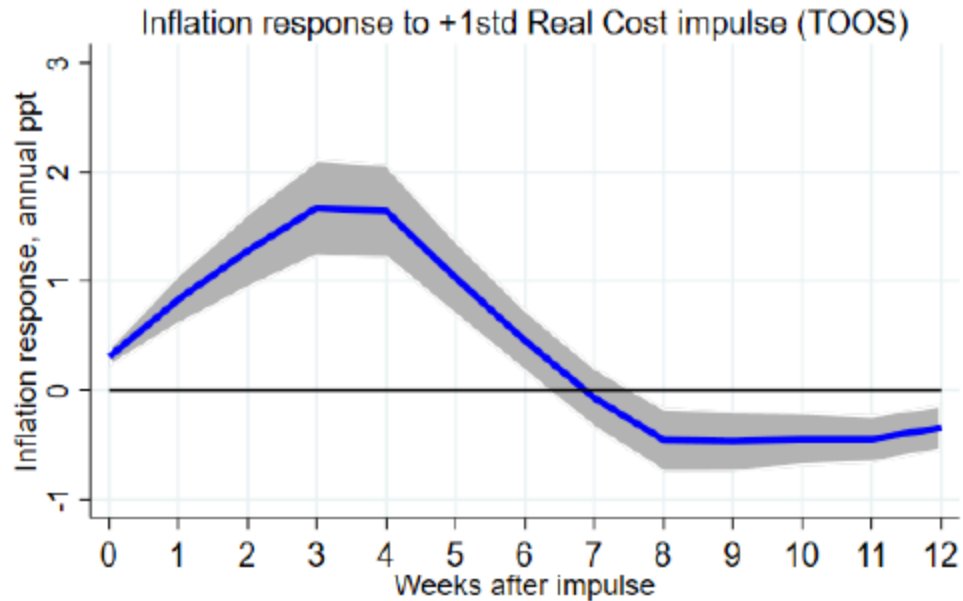


## Food and Beverages, USA



- Costs always higher for Electronics and now increasing for Food and Beverages

## Result 3: Retailers pass through higher cost to both prices and shortages



— Low import share

- - - High import share

- With endogenous stockouts
- Inflation responses are stronger but less persistent
- Inflationary impact twice as high for imported goods

## Key results and takeaways

- Widespread increase in shortages during the pandemic
- The composition and visibility of shortages changes over time → from temporary stockouts affecting nearly all categories to permanently discontinued goods concentrated in fewer sectors
- Shortages have economically significant inflationary effects, within 1 to 3 months
- Effects are larger and more persistent for imported goods and import-intensive sectors
- Co-movement of stockouts and prices suggest higher cost of replenishing inventories was an important driver of inflation in this period

THANK

YOU