

Immigrants, Imports, and Welfare: Evidence from Household Purchase Data

Brett McCully¹ (r) Torsten Jaccard² (r) Christoph Albert¹

¹Collegio Carlo Alberto

²Vancouver School of Economics

January 4, 2025

Immigrants, Real Wages, and Trade

- Political debates, and much of academic literature, tend to focus on nominal wage effects of immigration
 - ▶ But policy should be guided by the **real wage** effects of immigrants on native households

Immigrants, Real Wages, and Trade

- Political debates, and much of academic literature, tend to focus on nominal wage effects of immigration
 - ▶ But policy should be guided by the **real wage** effects of immigrants on native households
- Immigrants may affect consumption opportunities by changing:
 - ▶ the price of existing goods (Lach 2007; Cortes 2008; Zachariadis 2012)
 - ▶ the availability of new imported varieties

Immigrants, Real Wages, and Trade

- Political debates, and much of academic literature, tend to focus on nominal wage effects of immigration
 - ▶ But policy should be guided by the **real wage** effects of immigrants on native households
- Immigrants may affect consumption opportunities by changing:
 - ▶ the price of existing goods (Lach 2007; Cortes 2008; Zachariadis 2012)
 - ▶ the availability of new imported varieties
- **But does immigrant-induced trade make native households better off?**
 - ▶ If increased import expenditure simply reflects immigrant preferences, welfare effects for natives should be mediated

Overview and Results Preview

- [This paper](#): Link household scanner data to barcode-specific origin country for >600k barcodes
 - ▶ + country of birth for ~20k households
 - ▶ “Reduced-form” evidence for both [immigrant preferences](#) and [spillover channel](#) + structural model for counterfactual analysis

Overview and Results Preview

- **This paper:** Link household scanner data to barcode-specific origin country for >600k barcodes
 - ▶ + country of birth for ~20k households
 - ▶ “Reduced-form” evidence for both **immigrant preferences** and **spillover channel** + structural model for counterfactual analysis
- Counterfactual exercise 1: turn immigrants into natives
 - ▶ Aggregate grocery import expenditure ↓ by 7.7%
 - ▶ No effect on nonimmigrants grocery consumption welfare

Overview and Results Preview

- **This paper:** Link household scanner data to barcode-specific origin country for >600k barcodes
 - ▶ + country of birth for ~20k households
 - ▶ “Reduced-form” evidence for both **immigrant preferences** and **spillover channel** + structural model for counterfactual analysis
- Counterfactual exercise 1: turn immigrants into natives
 - ▶ Aggregate grocery import expenditure ↓ by 7.7%
 - ▶ No effect on nonimmigrants grocery consumption welfare
- Counterfactual exercise 2: remove immigrants
 - ▶ Aggregate grocery import expenditure ↓ by 26%
 - ▶ Welfare of natives due to groceries ↓ by 1%
 - ★ High-income, urban households benefit disproportionately

Overview and Results Preview

- **This paper:** Link household scanner data to barcode-specific origin country for >600k barcodes
 - ▶ + country of birth for ~20k households
 - ▶ “Reduced-form” evidence for both **immigrant preferences** and **spillover channel** + structural model for counterfactual analysis
- Counterfactual exercise 1: turn immigrants into natives
 - ▶ Aggregate grocery import expenditure ↓ by 7.7%
 - ▶ No effect on nonimmigrants grocery consumption welfare
- Counterfactual exercise 2: remove immigrants
 - ▶ Aggregate grocery import expenditure ↓ by 26%
 - ▶ Welfare of natives due to groceries ↓ by 1%
 - ★ High-income, urban households benefit disproportionately
- Counterfactual exercise 3: rise in variable trade costs
 - ▶ welfare cost 25% higher for immigrants

Data

Household Purchase and Product Origin Data

- Nielsen Homescanner dataset
 - ▶ Rotating panel of $\sim 50k$ US households with detailed socio-demographic information
 - ▶ Date, barcode, and price of each purchased consumer packaged good

Household Purchase and Product Origin Data

- Nielsen Homescanner dataset
 - ▶ Rotating panel of $\sim 50k$ US households with detailed socio-demographic information
 - ▶ Date, barcode, and price of each purchased consumer packaged good
 - ▶ Supplement with 2008 “Tell Me More About You” Survey
 - ★ Asks respondents place of birth
 - ★ $\sim 20k$ respondents survive to our sample period

Household Purchase and Product Origin Data

- Nielsen Homescanner dataset
 - ▶ Rotating panel of $\sim 50k$ US households with detailed socio-demographic information
 - ▶ Date, barcode, and price of each purchased consumer packaged good
 - ▶ Supplement with 2008 “Tell Me More About You” Survey
 - ★ Asks respondents place of birth
 - ★ $\sim 20k$ respondents survive to our sample period
- Barcode-specific information from Label Insight Inc.
 - ▶ Text information from packaging is extracted via machine learning
 - ▶ Imported goods and origin county identified from statements like “Made in ...”

Household Purchase and Product Origin Data

- Nielsen Homescanner dataset
 - ▶ Rotating panel of $\sim 50k$ US households with detailed socio-demographic information
 - ▶ Date, barcode, and price of each purchased consumer packaged good
 - ▶ Supplement with 2008 “Tell Me More About You” Survey
 - ★ Asks respondents place of birth
 - ★ $\sim 20k$ respondents survive to our sample period
- Barcode-specific information from Label Insight Inc.
 - ▶ Text information from packaging is extracted via machine learning
 - ▶ Imported goods and origin county identified from statements like “Made in ...”
- Merged data:
 - ▶ Covers $\sim 20\%$ of consumer expenditure on tradeables
 - ▶ Construct single cross-section using pooled data from 2014-2016

Import Expenditure Shares

Stylized Fact #1

Stylized Fact #2

General Gravity Model

General Gravity Model

Goal: separate **immigrant preferences** from **spillovers** in the effect of immigrants on imports

- Derive estimating equation from general gravity model at household-level

General Gravity Model

Goal: separate **immigrant preferences** from **spillovers** in the effect of immigrants on imports

- Derive estimating equation from general gravity model at household-level

Expenditure by household h on goods from origin country o , X_{oh} :

$$X_{oh} = \alpha_o \left(\frac{X_h}{\Phi_h} \right) \phi_{oc}^B z_{oh}$$

- X_h : Grocery expenditure by household h
- α_o : size, cost of production, trade policy vis-a-vis origin o
- Φ_h : Household h price index
- ϕ_{oc}^B : trade barriers between producers in o and consumers in county c
- z_{oh} : Demand shifter for goods from o by household h

General Gravity Estimating Equation: Import Supply

Assume $\phi_{us,c}^B = 1$ and $z_{us,h} = 1$ for all households h and counties c

- Define $\tilde{x}_o = x_o/x_{us}$ for any variable x

General gravity equation can be expressed as:

$$\tilde{X}_{oh} = \tilde{\alpha}_o \phi_{oc}^B z_{oh}$$

General Gravity Estimating Equation: Import Supply

Assume $\phi_{us,c}^B = 1$ and $z_{us,h} = 1$ for all households h and counties c

- Define $\tilde{x}_o = x_o/x_{us}$ for any variable x

General gravity equation can be expressed as:

$$\tilde{X}_{oh} = \tilde{\alpha}_o \phi_{oc}^B z_{oh}$$

- Allow immigrant population share I_{oc} and distance vector d_{oc} to affect trade costs:

$$\phi_{oc}^B = \exp\left(\rho d_{oc} + \beta^b I_{oc} + \eta_{oc}^b\right)$$

General Gravity Estimating Equation: Import Demand

In parameterizing demand shifter z_{oh} , we fully leverage household demographic information:

$$z_{oh} = \exp(\beta^z l_{oc}) \exp(\delta J_h + \zeta_1 \mathbf{1}[o(h) \neq o] + \zeta_2 \mathbf{1}[o(h) = o] + \eta_{oh}^z)$$

- β^z : average effect of immigrants on preferences \rightarrow cultural diffusion channel
- J_h : vector of household characteristics (income, education, etc.) \rightarrow parameter vector δ
- ζ_1 : immigrant demand-shifter for all origin countries,
- ζ_2 : immigrant demand-shifter for one's own origin country (homophily)
(as in Logan & Rhode 2010 and Atkin 2016)

General Gravity Estimating Equation

Plug definitions of ϕ_{oc}^B and z_{oh} back into expenditure equation and take logarithm:

$$\ln \tilde{X}_{oh} = \ln \tilde{\alpha}_o + \rho d_{oc} + \beta l_{oc} + \delta J_h + \zeta_1 \mathbf{1}[o(h) \neq o] + \zeta_2 \mathbf{1}[o(h) = o] + \eta_{oh}$$

$$\beta = \beta^b + \beta^z \qquad \eta_{oh} = \eta_{oc}^b + \eta_{oh}^z$$

- ζ_1 and ζ_2 shape **immigrant preference effect**
- β captures **spillover channel**: immigrants affect natives' purchases of imports

General Gravity Estimating Equation

Plug definitions of ϕ_{oc}^B and z_{oh} back into expenditure equation and take logarithm:

$$\ln \tilde{X}_{oh} = \ln \tilde{\alpha}_o + \rho d_{oc} + \beta l_{oc} + \delta J_h + \zeta_1 \mathbf{1}[o(h) \neq o] + \zeta_2 \mathbf{1}[o(h) = o] + \eta_{oh}$$

$$\beta = \beta^b + \beta^z \quad \eta_{oh} = \eta_{oc}^b + \eta_{oh}^z$$

- ζ_1 and ζ_2 shape **immigrant preference effect**
- β captures **spillover channel**: immigrants affect natives' purchases of imports
- Concern: $\text{cov}[l_{oc}, \eta_{oh}] \neq 0$
 - ▶ If immigrants sort into locations with idiosyncratically low trade costs to origin, for example, estimates of β biased upwards
 - Use Burchardi et al. (2019) push-pull IV [Detail](#)

General Gravity Estimates

	Dependent variable: Exp. share on goods from o relative to US	
	(1)	(2)
Immigrants/Pop. 2010	1.29*** (0.22)	1.15*** (0.24)
First-stage residuals		0.18 (0.31)
=1 if immigrant from anywhere	0.23*** (0.030)	0.23*** (0.030)
=1 if immigrant from origin o	0.60*** (0.069)	0.61*** (0.071)
N	1,461,130	1,461,130
Country FE	✓	✓
Household controls	✓	✓
Distance & latitude difference	✓	✓
1st-stage F-statistic		19.5

Notes: Level of observation: household-origin. Estimator: pseudo-Poisson maximum likelihood. First-stage residual is from first-stage regression of all instruments on immigrant-population share in column 2. Weights: NielsenIQ household weights. Standard errors: clustered two-ways at household and county-country levels.

*, **, and ***: 10%, 5%, and 1% levels, respectively.

Interpretations

Model + Counterfactual Exercises

Need for additional theory

Counterfactual Exercises

Melitz model w/ heterogeneous consumers + immigrant effects on trade costs, preferences

Detail

Estimation

- Counterfactual 1: Turn immigrants into natives
 - ▶ \uparrow fixed costs
 - ▶ \downarrow preference-driven market size
 - ▶ \downarrow preferences for imports z_{oh} ,
 - ★ Through immigrants' preferences ζ_1, ζ_2
- Counterfactual 2: Remove all immigrants (channels + expenditure)
 - ▶ All the above effects
 - + \downarrow county-specific expenditure market size
- Counterfactual 3: Trade cost shock
 - ▶ 10% increase in variable trade costs

Estimate Summary

Headline and Extensive Margin Estimates

Variable Cost Estimates

Counterfactual Outcomes: Removing Immigrant Effects

Counterfactual exercise:	(1) Change (%) import expenditure	(2) Change (%) welfare natives	(3) Change (\$) welfare per native HH
Turning immigrants into natives	-7.7	-0.039	-2.9

Counterfactual Outcomes: Removing Immigrant Effects

Counterfactual exercise:	(1) Change (%) import expenditure	(2) Change (%) welfare natives	(3) Change (\$) welfare per native HH
Turning immigrants into natives	-7.7	-0.039	-2.9
Shutting down ...			
... fixed trade cost channel	-2.0	-0.035	-2.6
... market size channel	-0.3	-0.005	-0.3
... composition channel	-5.7	–	–
... homophily channel	-1.4	–	–

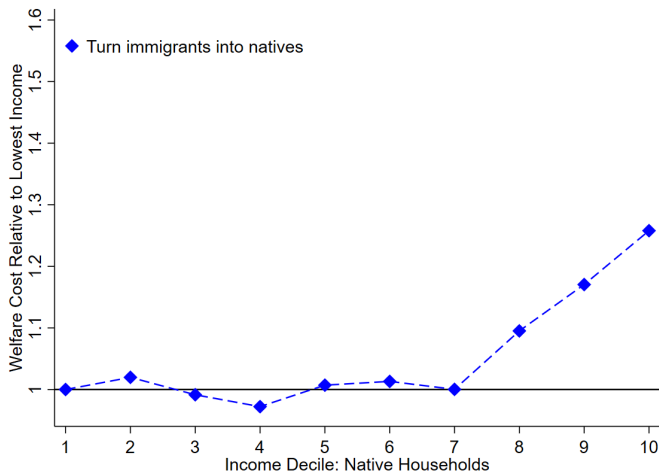
Counterfactual Outcomes: Removing Immigrant Effects

Counterfactual exercise:	(1) Change (%) import expenditure	(2) Change (%) welfare natives	(3) Change (\$) welfare per native HH
Turning immigrants into natives	-7.7	-0.039	-2.9
Shutting down ...			
... fixed trade cost channel	-2.0	-0.035	-2.6
... market size channel	-0.3	-0.005	-0.3
... composition channel	-5.7	–	–
... homophily channel	-1.4	–	–
Removing all immigrants	-26	-0.932	-70

Map

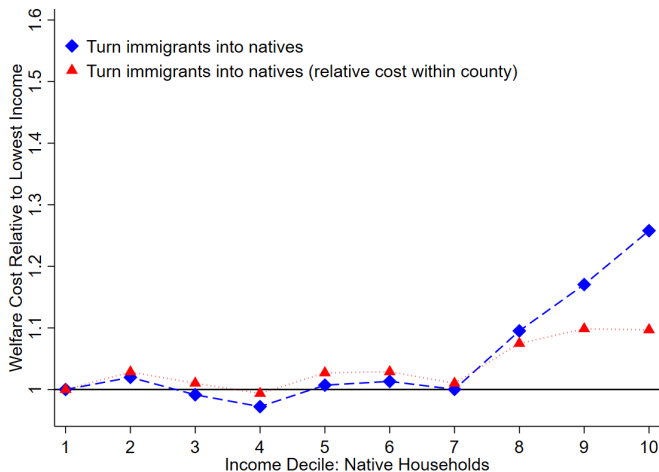
Distributional Effects on Consumption of Immigrants

Immigrants benefit highest income group ~60% more than low-to-middle income groups



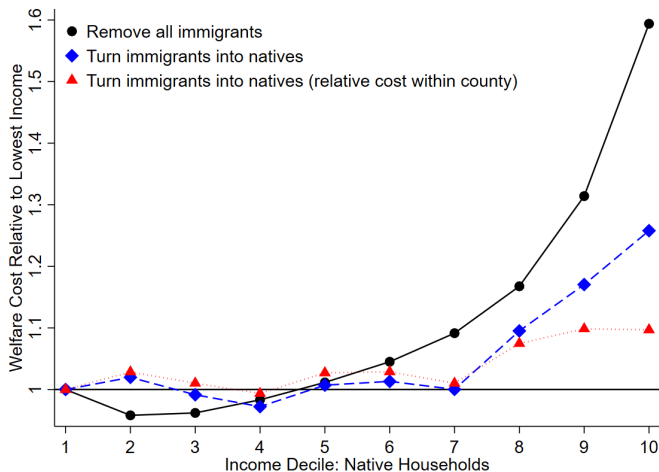
Distributional Effects on Consumption of Immigrants

Immigrants benefit highest income group ~60% more than low-to-middle income groups



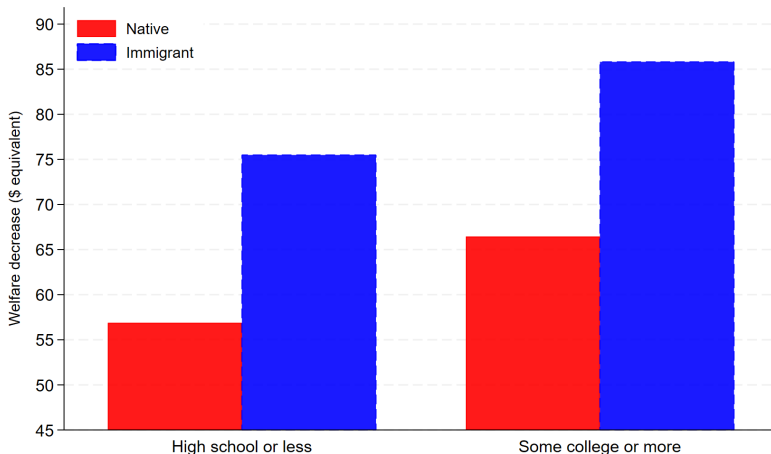
Distributional Effects on Consumption of Immigrants

Immigrants benefit highest income group ~60% more than low-to-middle income groups



The Distributional Costs of Increased Variable Trade Costs

Figure: Relative Costs of 10%↑ in Variable Trade Costs on All Imports (\$ per hh-year)



Summary and Conclusion

- First paper to provide direct evidence for local immigrant effects on non-immigrant household consumption choices
 - ▶ Link novel data on household consumption, nativity, and product origins
 - ▶ Effect due to lower fixed cost, larger market size
 - ▶ Market-size channel key for welfare effects
- Immigrant preferences important in driving trade flows
- Higher-income, urban households gain disproportionately
- Immigrants disproportionately harmed by increases in trade costs

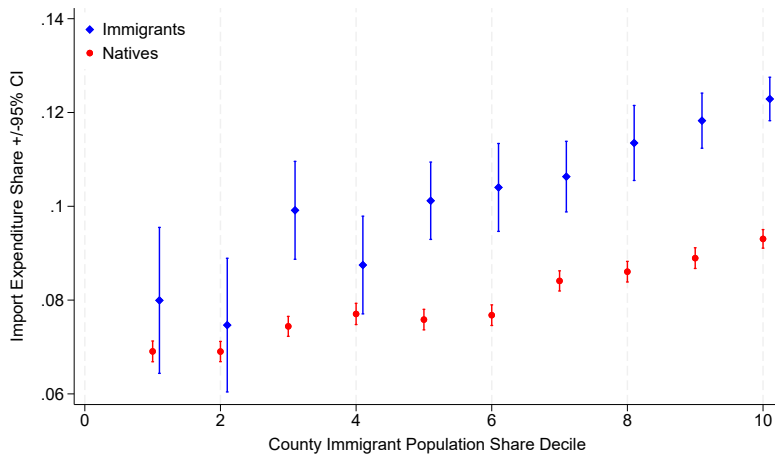
Appendix

Contribution to the Literature

- Quantify import, variety welfare effect of immigrants across households
 - ▶ Research on trade-immigrant link uses data aggregated to region/industry level
Gould 1994; Head & Ries 1998; Rauch & Trindade 2002; Combes et al. 2005; Peri & Requena-Silvente 2010; Parsons & Vezina 2018; Burchardi et al. 2019
 - ▶ When using disaggregated data, often no distributional effects
Iranzo and Peri 2009; Di Giovanni et al. 2015; Aubry et al. 2016; Bonadio 2024
- Estimate household-level effect of immigrants on price index
 - ▶ Prior work looks at aggregate/sectoral price changes
Lach 2007; Cortes 2008; Zachariadis 2012
 - ▶ Distributional effects primarily focus on labor market
e.g., Dustmann et al. 2013, Llull 2018
- New dimension of heterogeneity in import demand: immigrant status
 - ▶ Literature has focused on income/geography
Fajgelbaum & Khandelwal 2016, Borusyak & Jaravel 2021, Auer et al. 2023; Jaccard 2024
 - ▶ Key result: immigrant preferences are persistent
Bronnenberg et al. 2012, Atkin 2016

Immigrants Spend 34% More on Imported Goods than Natives

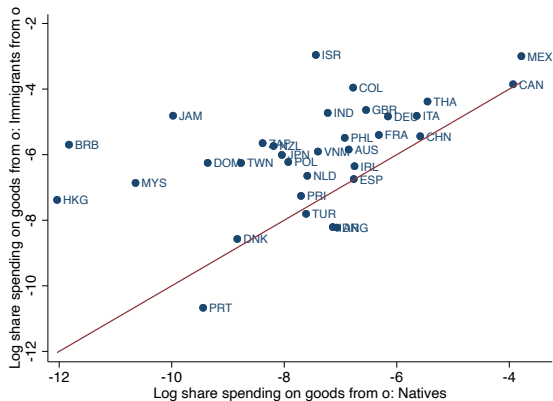
Stylized Fact 1



Immigrants Spend 2.2 Times More on Origin Imports

Stylized Fact 2

Figure: Consumption Homophily



Estimating β^f and β^z using Deflated \tilde{X}_{oh} and Deflated Extensive Margin

	\tilde{X}_{oh}/Z_{oh}		\tilde{N}_{oh}/Z_{oh}	
	(1)	(2)	(3)	(4)
Immigrants/Pop. 2010	1.50*** (0.22)	1.36*** (0.29)	1.29*** (0.12)	1.30*** (0.16)
First-stage residuals		0.18 (0.38)		-0.0089 (0.23)
N	1,461,130	1,461,130	1,461,130	1,461,130
Country FE	✓	✓	✓	✓
Distance & latitude difference	✓	✓	✓	✓
1st-stage F-statistic		20.2		20.2

Notes: The table presents regression results at the household-country level. We estimate each specification using pseudo-Poisson maximum likelihood estimation. The first-stage residual term is taken from a first-stage regression of all the instruments on the immigrant-population share in column 2. Observations are weighted using NielsenIQ household weights. Standard errors clustered two-ways at the household and origin-by-destination levels. *, **, and *** denote statistical significance at the 10%, 5%, and 1% levels, respectively.

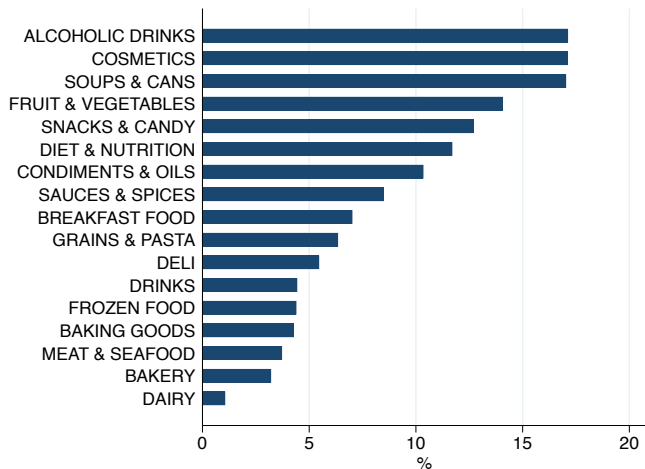
Back

Estimating β^τ using Marginal Cost Expression

	Dependent variable: Log Average Barcode Price			
	(1)	(2)	(3)	(4)
Immigrants/Pop. 2010	-0.041*** (0.013)	-0.017 (0.031)	-0.058*** (0.016)	-0.040 (0.044)
N	2,261,777	2,261,777	1,601,674	1,601,674
Barcode FE	✓	✓	✓	✓
County FE	✓	✓	✓	✓
Distance & latitude difference	✓	✓	✓	✓
1st-stage F-statistic		17.3		17.5
Sample	All	All	∪ 100 Counties	∪ 100 Counties

Notes: The table presents two-stage least square regression results at the barcode-county level. The instrumental variables strategy is described in Section ?? . Standard errors are clustered at the barcode and country level. *, **, and *** denote statistical significance at the 10%, 5%, and 1% levels, respectively.

Variation in Share of Expenditures on Imported Varieties Across Products



County-Level Immigrant-Import Semi-Elasticity

Plugging functional form assumptions back into \tilde{X}_{oh} and aggregating to county-level \tilde{X}_{oc} :

$$\begin{aligned}\frac{\partial \ln \tilde{X}_{oc}}{\partial I_{oc}} &= \frac{\partial \ln \phi_{oc}^B}{\partial I_{oc}} + \frac{\partial \ln \phi_{oc}^Z}{\partial I_{oc}} \\ &= \underbrace{\left[\beta^\tau + \beta^f \right]}_{\text{Trade cost channel}} + \underbrace{\left[\frac{\theta}{\sigma - 1} - 1 \right] \left(\beta^z + \frac{\partial \ln \bar{z}_{oc}}{\partial I_{oc}} \right)}_{\text{Market size channel}} + \underbrace{\beta^z}_{\text{Cultural diffusion channel}} + \underbrace{\frac{\partial \ln \bar{z}_{oc}}{\partial I_{oc}}}_{\text{Composition channel}}\end{aligned}$$

- Two keys:

- ▶ Only first two channels are welfare-relevant for native households
- ▶ Data contains empirical moments needed to estimate each channel separately

Model Primitives: Heterogeneous Firms with Heterogeneous Consumers

Preferences: CES w/ $\sigma > 1$ and z_{oh} demand shifter identical as in general gravity.

Production: Variable trade costs $\tau_{o,c(h)}$ and fixed costs $f_{o,c(h)}$; productivity drawn from Pareto distribution with shape parameter $\theta > \sigma - 1$.

- **Additional Assumptions:** (1) monopolistic competition; (2) potential entrants proportional to country size

Model Primitives: Heterogeneous Firms with Heterogeneous Consumers

Preferences: CES w/ $\sigma > 1$ and z_{oh} demand shifter identical as in general gravity.

Production: Variable trade costs $\tau_{o,c(h)}$ and fixed costs $f_{o,c(h)}$; productivity drawn from Pareto distribution with shape parameter $\theta > \sigma - 1$.

- **Additional Assumptions:** (1) monopolistic competition; (2) potential entrants proportional to country size
- Equilibrium expenditure:

$$\tilde{X}_{oh} = \underbrace{\tilde{Y}_o \tilde{W}_o^{-\theta}}_{\tilde{\alpha}_o} \underbrace{(\tilde{\tau}_{o,c(h)})^{-\theta} (\tilde{f}_{o,c(h)})^{-[\frac{\theta}{\sigma-1}-1]} (z_{o,c(h)})^{[\frac{\theta}{\sigma-1}-1]}}_{\phi_{oc}^B} \underbrace{z_{oh}}_{\phi_{oh}^Z}$$

- $z_{o,c(h)}$: Average demand shifter of all households in county c

Estimating Model Components: Overview

- 1 Collect all origin-county terms into ψ_{oc} fixed effect and estimate δ , ζ_1 , and ζ_2 :

$$\ln \tilde{X}_{oh} = \psi_{oc} + \delta J_h + \zeta_1 + \zeta_2 + \eta_{oh}^z$$

Estimating Model Components: Overview

- 1 Collect all origin-county terms into ψ_{oc} fixed effect and estimate δ , ζ_1 , and ζ_2 :

$$\ln \tilde{X}_{oh} = \psi_{oc} + \delta J_h + \zeta_1 + \zeta_2 + \eta_{oh}^z$$

- 2 Use estimates and Census data to construct household- and county-level preferences \hat{Z}_{oh} and $\hat{\bar{Z}}_{oc}$: $\mathcal{Z}_{oh} = \hat{\bar{Z}}_{oh} \hat{\bar{Z}}_{o,c(h)}^{(\theta/\sigma-1)-1}$ (assume $\theta = \sigma = 5$)

Estimating Model Components: Overview

- 1 Collect all origin-county terms into ψ_{oc} fixed effect and estimate δ , ζ_1 , and ζ_2 :

$$\ln \tilde{X}_{oh} = \psi_{oc} + \delta J_h + \zeta_1 + \zeta_2 + \eta_{oh}^z$$

- 2 Use estimates and Census data to construct household- and county-level preferences \hat{z}_{oh} and \hat{z}_{oc} : $\mathcal{Z}_{oh} = \hat{z}_{oh} \hat{z}_{o,c(h)}^{(\theta/\sigma-1)-1}$ (assume $\theta = \sigma = 5$)
- 3 Deflate expenditure by \mathcal{Z}_{oh} and estimate β using same IV as general gravity model

$$\ln \frac{\tilde{X}_{oh}}{\mathcal{Z}_{oh}} = \alpha_o + \rho d_{o,c(h)} + \beta l_{o,c(h)} + \eta_{o,c(h)} + \eta_{oh}^z$$

Estimating Model Components: Overview

- ❶ Collect all origin-county terms into ψ_{oc} fixed effect and estimate δ , ζ_1 , and ζ_2 :

$$\ln \tilde{X}_{oh} = \psi_{oc} + \delta J_h + \zeta_1 + \zeta_2 + \eta_{oh}^z$$

- ❷ Use estimates and Census data to construct household- and county-level preferences \hat{z}_{oh} and \hat{z}_{oc} : $\mathcal{Z}_{oh} = \hat{z}_{oh} \hat{z}_{o,c(h)}^{(\theta/\sigma-1)-1}$ (assume $\theta = \sigma = 5$)
- ❸ Deflate expenditure by \mathcal{Z}_{oh} and estimate β using same IV as general gravity model

$$\ln \frac{\tilde{X}_{oh}}{\mathcal{Z}_{oh}} = \alpha_o + \rho d_{o,c(h)} + \beta l_{o,c(h)} + \eta_{o,c(h)} + \eta_{oh}^z$$

- ❹ Separately identify components of β :
- ▶ β^τ : Elasticity of barcode-level price to immigration population
 - ▶ β^f and β^z : Extensive margin elasticity versus total elasticity

Parameter Estimate Summary

- Preference parameters:
 - ▶ $\hat{\zeta}_1 = 0.23$ (0.03); $\hat{\zeta}_2 = 0.64$ (0.07)
 - ▶ $\hat{\delta}$: import preference generally increasing in income and education
- Spillover parameters: $\hat{\beta} = 1.36^{***}$:
 - ▶ $\hat{\beta}^\tau \rightarrow$ indistinguishable from zero
 - ▶ $\hat{\beta}^f = 1.28$
 - ▶ $\hat{\beta}^z = 0.06$
- Extensive margin effect dominates \implies fixed cost reduction channel is vast majority of aggregate spillover effect
 - ▶ Note that this channel is welfare-relevant

Instrumental Variables for Immigrant Population Share $I_{o,c}$

We make use of IV strategy from [Burchardi, Chaney, and Hassan \(2019, REStud\)](#)

- Predict immigrant stock using vector of historic inflows
 - ▶ Use interaction between [origin-specific immigrant flows to US by decade](#) and [attractiveness of counties to all immigrants by decade](#), for decades 1880–2000
 - ▶ Leave-out all countries in continent of origin o and all counties in Census region of c

Instrumental Variables for Immigrant Population Share $I_{o,c}$

We make use of IV strategy from [Burchardi, Chaney, and Hassan \(2019, REStud\)](#)

- Predict immigrant stock using vector of historic inflows
 - ▶ Use interaction between [origin-specific immigrant flows to US by decade](#) and [attractiveness of counties to all immigrants by decade](#), for decades 1880–2000
 - ▶ Leave-out all countries in continent of origin o and all counties in Census region of c
- For each decade D , county c , and origin o , construct following instrument:

$$\widetilde{IV}_{o,c}^D = I_{o,-r(c)}^D \times \frac{I_{-C(o),c}^D}{I_{-C(o)}^D}$$

- One IV for each decade-origin-county triplet, so 12 IV's for each origin-county pair
 - ▶ Implement control function approach with PPML ([Atalay et al. 2019](#))

Estimating Equation at Household-Origin Level

$$\ln \tilde{X}_{oh} = \alpha_o + \rho d_{o,c(h)} + \beta l_{o,c(h)} + \ln \bar{z}_{o,c(h)}^{\frac{\theta}{\sigma-1}-1} \\ + \delta J_h + \zeta_1 \mathbf{1}[o(h) \neq US] + \zeta_2 \mathbf{1}[o(h) = o] + \eta_{o,c(h)} + \eta_{oh}^z$$

$$\beta = \beta^f + \beta^\tau + \left(\frac{\theta}{\sigma-1}\right)\beta^z$$

$$\rho = \rho^\tau + \rho^f \quad \eta_{o,c(h)} = \eta_{o,c(h)}^\tau + \eta_{o,c(h)}^f$$

$$\bar{z}_{o,c(h)} = \sum_{h \in \Lambda_c} \kappa_h e^{[\delta J_h + \zeta_1 \mathbf{1}[o(h) \neq US] + \zeta_2 \mathbf{1}[o(h) = o] + \eta_{oh}^z]}$$

General Gravity Estimation Summary

- $\hat{\beta} = 1.15$:
 - ▶ 1 ppt increase in I_{oc} \uparrow expenditure on imports from o by 1.15% for all households
 - ▶ Aggregate immigrant population share $\sim 15\%$ in US
- $\hat{\zeta}_1 = 0.23$:
 - ▶ Immigrants have stronger preferences for all imported varieties, regardless of origin
 - ▶ 26% higher expenditure on all import origins than otherwise identical native household
- $\hat{\zeta}_2 = 0.61$:
 - ▶ Immigrants have stronger preference for imports specifically from their origin country
 - ▶ 132% higher expenditure on imports from specific origin

Model Primitives

Preferences: utility of consumer h in us county c

$$U_h = (q_{0,h})^{\mu_0} \left[\sum_{o \in \mathcal{O}} z_{oh}^{\frac{1}{\sigma}} \int_{\omega \in \Omega_{o,c(h)}} (q_{oh}(\omega))^{\frac{\sigma-1}{\sigma}} d\omega \right]^{\frac{\sigma}{\sigma-1}(1-\mu_0)}$$

- Expenditure on groceries: $X_h = (1 - \mu_0) Y_h$ on groceries
- Heterogeneous preferences z_{oh} s.t. $z_{us,h} = 1$ for all $\omega \in \Omega_{us,c(h)}$

Production: cost of providing q units to consumers in c for producer in country o with productivity ϕ

$$c_{oc}(q) = \frac{w_o \tau_{oc}}{\phi} q + f_{oc}$$

Back

Need for Additional Theory

Strong evidence for both **composition** and **spillover** effects of immigrants on import expenditure

Need for Additional Theory

Strong evidence for both **composition** and **spillover** effects of immigrants on import expenditure

- Cannot disentangle welfare-relevant component of spillover (β^b) from preferences/sorting of native households (β^z)
- If market size effects matter, immigrant preference for all imports ($\zeta_1 > 0$) suggests reduced form is mis-specified
 - ▶ Regressing origin-specific expenditure on origin-specific population misses level effect of immigrants increasing import expenditure from **all origins**

Need for Additional Theory

Strong evidence for both **composition** and **spillover** effects of immigrants on import expenditure

- Cannot disentangle welfare-relevant component of spillover (β^b) from preferences/sorting of native households (β^z)
- If market size effects matter, immigrant preference for all imports ($\zeta_1 > 0$) suggests reduced form is mis-specified
 - ▶ Regressing origin-specific expenditure on origin-specific population misses level effect of immigrants increasing import expenditure from **all origins**
- Rest of talk: modify heterogeneous firms model of trade to identify separate channels and run counterfactual exercises

Back

The Trade-Creating Effect of Immigrants

Magnitude of Percentage Decrease in Import Expenditure of Removing Immigrant Effects

