## Section 11: Bartik Instruments

Valentine Gilbert

April 28, 2022

## Overview

Intuition

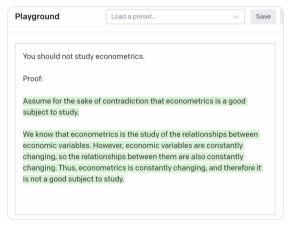
Derenoncourt (2022) - Can You Move to Opportunity?

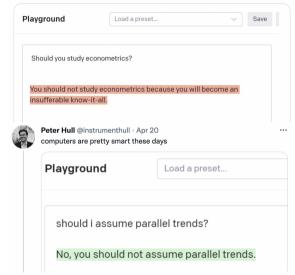
Final Exam Review



## GPT-3 passes the Turing test for Twitter critique of economic thought with flying colors

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## **Bartik Instruments: Intuition**

- Bartik instruments combine an aggregate-level shock with local shares to predict changes in the endogenous variable
- This is also called a shift-share instrument because it combines aggregate shifts with local shares
- Instrument is  $B_l = \sum_k g_k s_{lk}$
- Example: Immigrant enclaves and labor supply elasticity
  - Shifts: Country-of-origin *k* outflows
  - Shares: Share of immigrants from a given country k that work in a given local labor market l
  - → Instrument for changes in immigrant labor supply

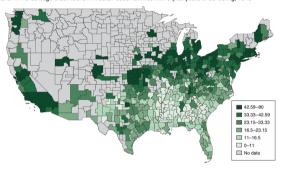
### **Bartik Instruments: Identification**

- Like any instrument, Bartik instruments must satisfy our IV assumptions in order to be valid
  - Relevance
  - Exclusion restriction
- For Bartik instruments, identification can come from the shares
  - Shares must be uncorrelated with other factors related to changes in the outcome
  - E.g. Immigrant enclaves uncorrelated with demand shocks
- Or they can come from the shocks
  - Shocks must be conditionally random
  - E.g. Outflows from country-of-origin are conditionally random

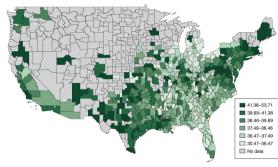
## **Summary**

- Derenoncourt (2022) studies the effects of the Great Migration on economic opportunity in northern cities
- Four million African American migrants from the Jim Crow South to the urban North and West between 1940 and 1970
- Led to a large change in the racial composition of many cities
- How did northern cities respond? How did rates of upward mobility change?
- Uses Bartik instrument for increase in urban Black population

Panel A. Percentage Black teens in median-educ. families with 9-plus years of schooling, 1940



Panel B. Household inc. rank of Black individuals from below-median-income families, 2015



## Endogenous variable: Black population change

We want to know the effect of Black population change from 1940-1970

- Data from the census and County and City Data Book 1944-1977
- Sample of 130 non-southern CZs

$$\Delta ext{Black pop}_{\textit{CZ}}^{1940-1970} = rac{b_{\textit{urban},\textit{CZ}}^{1970} - b_{\textit{urban},\textit{CZ}}^{1940}}{ ext{pop}_{\textit{urban},\textit{CZ}}^{1940}}$$

Function is right-skewed
→ convert to quantiles, GM<sub>CZ</sub>

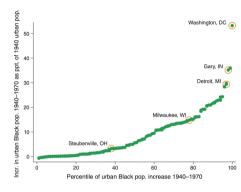


FIGURE 2. QUANTILES OF URBAN BLACK SHARE INCREASES, 1940-1970

Notes: This figure plots the quantile function of 1940–1970 increases in the urban Black population in CZs as a share of the total initial 1940 urban population, multiplied by 100 so that the units are percentage points. The CZs in sample are those containing the 296 non-southern maintain cities with information on the Black population in both 1940 and 1970 from the CCDB. Non-southern maintained excludes cities in the following states: Alabama, Alaska, Arkansas, Florida, Georgia, Hawaii, Kentucky, Louisiana, Mississippi, North Carolina, Oklahoma, South Carolina, Arkansas, Florida, Georgia, Hawaii, Kentucky, Louisiana, Mississippi, North Carolina, Oklahoma, South Carolina, Tennessee, Texas, Virginia, and West, Virginia, and West, Washington, D. Can dicties in Delaware and Maryland were net receivers of Black migrants during the Great Migration and are included in the sample. The city of New Albany, IN is in the Louisville, KY CZ, which is included in the sample. Results are robust to excluding this CZ.

Source: CCDB

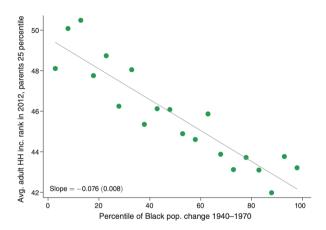


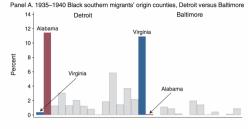
FIGURE 3. RELATIONSHIP RETWEEN 1940–1970 BLACK POPULATION CHANGE AND UPWARD MOBILITY IN THE 2000s

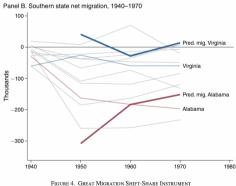
Notes: This binned scatterplot depicts the relationship between average upward mobility in the 2000s for men and women with low income parents and the percentile of actual Black population increase during the Great Migration (1940–1970) for northern CZs. The unit of observation is a CZ. The right-hand-side variable is grouped into 20 bins (5 percentiles each). Upward mobility is defined as expected mean household income rank for men and women with parents at the twenty-fifth percentile of the parent income distribution. Income is measured from IRS tax returns for cohorts and parents of cohorts born between 1980 and 1986.

Sources: IPUMS complete count 1940 US census, CCDB

# To get causal effect of GM, need to instrument

- Why?
- Bartik instrument takes advantage of linkages between origin counties and destination cities
- Idea: Interact net migration from counties with initial shares in cities
- Any concerns?
- Even better: Interact net migration predicted by push factors with intial shares





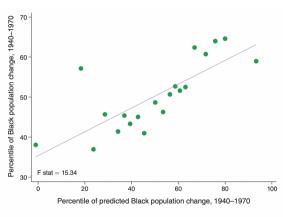


FIGURE 5. FIRST STAGE ON BLACK POPULATION CHANGE

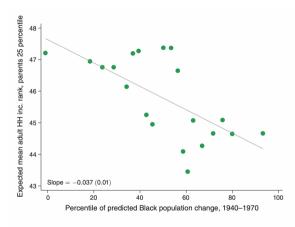


Figure 6. Great Migration Reduced Average Upward Mobility in Northern CZs  $\,$ 

Panel A. First stage on GM 0.297 0.297 0.297 0.297 0.297 0.297  $\widehat{GM}$ (0.0550) (0.0550) (0.0550) (0.0550) (0.0550) (0.0550)

(0.07	39) (0.0739)	(0.0739)	(0.0739)	(0.0739)	(0.0739)	
F-stat 15.3	4 15.34	15.34	15.34	15.34	15.34	

Men

-0.0742

(0.0104)

0.593

-0.0432

(0.0103)

0.495

-0.145

(0.0354)

130

44.55

3.617

28.98

Pooled

-0.0331

(0.0108)

0.345

-0.0282

(0.00965)

0.341

-0.0950

(0.0353)

130

45.54

2.972

28.98

Women

-0.00375

(0.0137)

0.254

-0.0128

(0.0121)

0.260

-0.0432

(0.0410)

130

42.74

3.527

28.98

Men

-0.0618

(0.0108)

0.492

-0.0439

(0.0101)

0.443

-0.148

(0.0386)

130

48.29

3.375

28.98

	Hor	Household income rank			Individual income rank			
F-stat	15.34	15.34	15.34	15.34	15.34	15.34		

Women

-0.0570

(0.0101)

0.528

-0.0308

(0.00973)

0.451

-0.104

(0.0318)

130

47.04

3.283

28.98

Pooled

(0.00995)

0.571

-0.0370

(0.00974)

0.481

-0.125

(0.0328)

130

45.79

3.379

28.98

-0.0655

Panel B. OLS GM

Panel D. 2SLS GM

Observations

Mean rank

St. dev. rank

St. dev. GM

Panel C. Reduced form

 $R^2$ 

 $\widehat{GM}$ 

 $R^2$ 

Tarle 2—Lower Average Upward Morility in 2000s for Low-Income Families in Great Migration CZs

F-stat	15.34	15.54	15.34	15.34	15.34	15.34	
	Hou	Household income rank			Individual income rank		

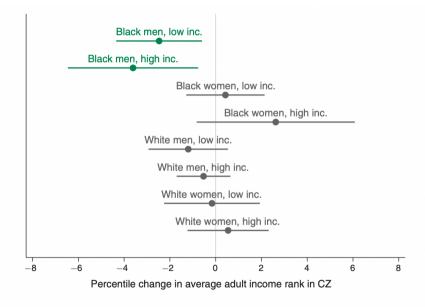


Figure 8. Race and Gender Heterogeneity in Impact of Great Migration on Upward Mobility

- How do you interpret this?
- Results could be due to changes in place effects or selection
- But changes in exposure effects explain all of the effect on observed upward mobility
- Lower upward mobility in GM destinations because something about those locations changed

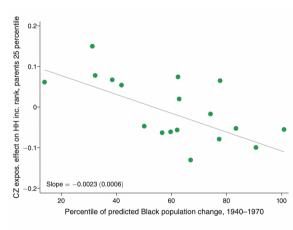


Figure 7. Childhood in Great Migration CZs Lowers Adult Income of Children from Low Income Families

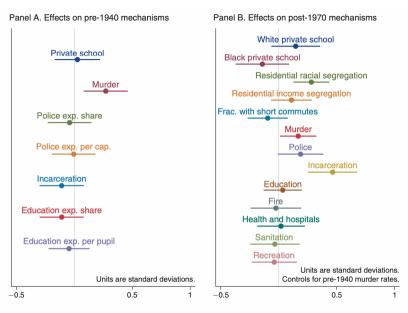


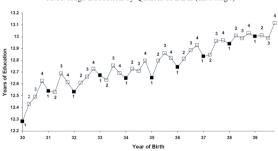
FIGURE 9. GREAT MIGRATION CZS HAVE HIGHER SEGREGATION, CRIME, AND POLICING

#### Pre-midterm

- Fundamentals
  - Potential outcomes
  - Selection on observables
- RCTs
  - Power
  - Attrition
- Inference
  - Clustering
  - Bootstrapping
  - Randomization inference
- IV
  - LATE framework
  - MTEs

Observed outcome 
$$\longrightarrow Y_i = \begin{cases} Y_{1i} & \text{if } D_i = 1 \\ Y_{0i} & \text{if } D_i = 0 \end{cases}$$
 Potential outcomes

A. Average Education by Quarter of Birth (first stage)



### Post-midterm

- RD
  - Sharp vs Fuzzy
  - Parametric vs Nonparametric
  - Validity checks
- DiD
  - Event studies
  - TWFE regressions, problems, and solutions
  - Synthetic control, fuzzy DiD, matched DiD
- Bartik + Structural

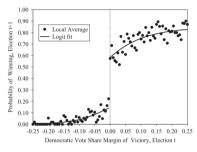


Figure A.8: Raw Plots of Number of Applications in Control and Treatment ZIPs

