Can you move to opportunity? Evidence from the Great Migration *

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Mean income rank of Black men and women from 1978-1983 birth cohorts with median income parents, by childhood CZ.

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1940: A pivotal moment in Great Migration North



Data from US Census.

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Reactions in the North



Riot against integrated federal housing project in Detroit, '42. Source: LOC.

Context: Magnitude of post-1940 Black inflows transformed northern cities, plausibly altering upward mobility in the long run.

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Question: Did the Great Migration reduce the gains from growing up in northern destination cities?

Empirical strategy: Use within-North variation in Great Migration. Shift-share based instrument for 1940-1970 Black population changes in urban northern commuting zones:

- Pre-1940 Black southern migrant location choices
- Predicted county out-migration using LASSO-selected variables

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- 4. Mechanisms: rising segregation and urban decline post-1960.
 - White flight from public schools and urban neighborhoods
 - Increased investment in policing; higher crime and incarceration

Literature review

· Upward mobility, racial inequality, and neighborhood effects

Chetty, Hendren, Jones, and Porter (2018); Chetty and Hendren (2018a, 2018b); Ananat (2011); Andrews et al. (2017); Card et al. (2018); Chetty, Hendren, and Katz (2016); Cutler and Glaeser (1997); Graham (2016); Kasy (2015); Kling, Liebman, and Katz (2007); Massey and Denton (1990); Mazumder and Davis (2018); Ludwig et al (2012); Rothstein (2017); Wilson (1987).

• Great Migration and Black economic history

 Boustan (2009); Boustan (2010); Boustan (2016); Black et al. (2015); Collins and Margo (2007); Collins and Wanamaker (2015); Eriksson (2018); Eriksson and Niemesh (2016); Fouka, Mazumder, Tabellini (2018); Margo (1990); Muller (2012); Shertzer and Walsh (2016); Stuart and Taylor (2017); Tabellini (2018).

Local public finance

Alesina, Baqir, and Hoxby (2004); Epple and Romano (1996); Tiebout (1956).

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Outline

- I. Historical context
- II. Data on upward mobility and city demographics
- III. Great Migration instrument
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 - i. Upward mobility
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The Great Migration

Post-WWI Migrants to Chicago, on leaving the South:

- Some of my people were here.
- Persuaded by friends.
- FOR BETTER WAGES.
- TO BETTER MY CONDITIONS.
- BETTER CONDITIONS.
- BETTER LIVING.
- More work; came on visit and stayed.
- WIFE PERSUADED ME.
- TIRED OF THE SOUTH.
- TO GET AWAY FROM THE SOUTH.

- From Isabel Wilkerson's The Warmth of Other Suns: The Epic Story of America's Great Migration



"My mother was my inspiration... She was one of those 6,000,000 Black people who left the South so that her children wouldn't have to grow up and put up with what she had to grow up and put up with."

On Brown v. Board: "I was surprised. I didn't go to school in the South. I didn't know that they didn't even go to school together down there."

- Helen Singleton, Civil Rights activist from Los Angeles

▶ 1940 mobility

Regional patterns in Black economic progress today

"There is no region in the United States where it is better to be poor and Black compared to being equally poor and white."

- Davis and Mazumder, 2018



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Data on upward mobility

- Historical: IPUMS 1940 US Complete Count Census ("CC")
 - Universe of enumerated individuals ($N \approx 132$ million)
 - Education outcomes for teens and parents in same household
 - Location, race, and other demographics available

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 - Location, race, and other demographics available
- Modern: Chetty et al. (2018); Chetty and Hendren (2018b)
 - Income for parents and kids from US federal tax records
 - · Parents and kids linked through dependent claiming
 - Upward mobility measures for 1980s birth cohorts
 - Linked to Census for information on race

Data on upward mobility

Measures:

• 1940: Fraction of teenagers in CZ with 9+ years of schooling; parent has 5-8 years of schooling

[method similar to Card, Domnisoru, and Taylor (2018)]

- Pre-1940: School attendance of teens with low occupation score fathers
- 2000s: CZ-level estimated income rank (individual and household), for individuals from parent percentiles 25 and 75
 - Kids and parents ranked nationally within child birth cohort.
- Correlation coefficient: 0.49
 - Correlation between income upward mobility and high school graduation rates for low income families today: .65.

Relationship between 1940 and 2015 mobility measures



Sample is commuting zones in continental US. • White only

Data on urban CZ demographics during Great Migration

- Sample: 130 non-southern, continental US commuting zones
- Criteria:
 - 1. Cities in CZ observed in City Data Books, 1944-1977
 - Includes cities with population 25,000 or more in survey year
 - 294 cities with Black population data in 1940 and 1970
 - 2. CZ in net-receiving state during Great Migration
 - Census division Northeast, Midwest, West plus Maryland, Delaware, and Washington, $D.C.^{\dagger}$
- **Coverage:** 85% of non-southern US pop (97% of non-southern Black); 58% of overall US pop (50% of Black)

[†]DC, DE, and MD were net receivers. See Boustan (2016).

Measure of Black population change

Black pop change_{CZ} =
$$\frac{b_{urban,CZ}^{1970} - b_{urban,CZ}^{1940}}{pop_{urban,CZ}^{1940}}$$

- $b_{urban,CZ}^t$ is the total Black population in all sample cities in commuting zone CZ in year t.
- GM_{CZ}, percentile of Black pop change is key regressor.

Quantile function of urban Black pop increases, 1940-1970



Northern urban CZs. Data source: 1940 Census and City and County Data Books 1944-1977.


Black pop \uparrow from 1940-1970 and upward mobility in 2012



Observations are northern commuting zones. Outcomes for Black and white families. *Data source*: Chetty and Hendren (2018); IPUMS 1940 Census; and City and County Data Books, 1944-1977.

1940 correlates of Black pop \uparrow during Great Migration



Correlation between 1940-1970 Black population increases in sample CZs and baseline 1940 characteristics. *Data source*: IPUMS 1940 Census; City and County Data Books, 1944-1977.

Motivation for instrument

- Increases in the Black population during Great Migration not randomly assigned
- Omitted CZ characteristics may drive increases in Black population and changes in upward mobility

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Boustan (2010) adapted shift-share instrument (Altonji and Card, 1991; Card 2001) to Great Migration context:

Instrument intuitively combines

- 1. Distinctive southern migrant composition in northern cities
- 2. Variation in southern state net-migration flows

Distinctive southern migrant composition in northern cities



Migration weights for \sim 320,000 Black respondents who list southern county of residence in 1935 \neq current county. Weight shown for largest county by southern state (e.g., Jefferson County, AL and Richmond City County, VA). *Data source*: IPUMS 1940 complete count census.

Variation in southern state net-migration flows



Southern net-migration estimates (1000s). Data source: Foukas et al. (2018); Boustan (2016).

Variation in southern state net-migration flows

Use "push" factors.



Southern net-migration estimates (1000s). Data source: Foukas et al. (2018); Boustan (2016).

New version of instrument for Black pop \uparrow during GM

Percentile of predicted Black pop change from 1940 to 1970, where

Pred Black Pop
$$\uparrow = \sum_{j \in S} \sum_{c \in CZ} \omega_{jc}^{1935-1940} \times \hat{m}_{j}^{1940-1970}$$

where

- $\omega_{jc}^{1935-1940}$ is share of recent Black migrants from southern county *j* living in northern city *c* in 1940
- $\hat{m}_{j}^{1940-1970}$ is total predicted 1940-1970 net-migration from j

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With following features:

- 1. Shares ω at southern county, not state, level ($|S| \sim 1200$): Universe of 1935-1940 Black southern migrants (1940 CC)
- 2. Predicted county migration \hat{m} using Post-LASSO Details

Intuition:

Instrument modifies ranks using only southern variation in northern Black population change

Identification condition

Conditional on baseline upward mobility and other covariates, Great Migration shock (\hat{GM}_{CZ}) to location CZ must be orthogonal to omitted variables (ε_{CZ}) that also impact upward mobility in CZ:

$$\mathbb{E}[\hat{GM}_{CZ} \cdot \varepsilon_{CZ} | \mathbb{X}_{CZ}] = 0$$

Baseline 1940 covariates X_{CZ} include:

- Educational upward mobility
- Manufacturing share
- Demand for southern Black labor[‡]
- · Census division fixed effects

Examples of ε_{CZ} : pre-1940 educational upward mobility; median education levels in 1940. • Bartik Debate

[‡]Defined as 1935-40 Black southern migrant share of 1940 urban population.

Placebo test: No effect of Great Migration on pre-1940 upward mobility

Table: Regression of \hat{GM} on pre-period outcomes

	Fraction of teens			Median
	with low	adult		
	attending school			education
	1920	1930	1940	1940
ĜM	0.011	0.023	0.018	-0.013
	(0.024)	(0.029)	(0.015)	(0.009)
Baseline mean	65.477	74.912	80.676	27.355
Std Dev	7.425	8.674	5.710	2.863
Observations	130	130	130	130
Baseline Controls	Y	Y	Y	Y

Data from IPUMS Complete Count Censuses 1920-1940. Sample for school attendance is 14-17 year old boys and girls with fathers who have below median occupation scores. Last column is weighted county-average median educational attainment of adults at the CZ level.

Empirical specification

$$\bar{Y}_{p,CZ} = \alpha + \beta GM_{CZ} + \mathbb{X}'_{CZ}\Gamma + \varepsilon_{CZ}$$

First Stage: $GM_{CZ} = \gamma + \delta \hat{GM}_{CZ} + \mathbb{X}'_{CZ}\mu + \epsilon_{CZ}$

- $\bar{Y}_{p,CZ}$: Mean adult inc. rank for kids, parents at percentile p
- GM_{CZ} : Pctile of Black pop. \uparrow , 1940-1970 (30 pctile \approx 1 s.d.)
- X_{CZ}: Baseline 1940 controls (including 1940 upward mobility)

First stage F-stat = 15. \bigcirc Graph

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Results on upward mobility

1. Did the Great Migration reduce upward mobility in the North?

Selection versus location

Children's outcomes conditional on parent income rank p are function of location and unobserved family characteristics:

$$y_{ipc} = \mu_{pc} + \theta_{ipc}$$

Average upward mobility in a commuting zone:

$$\bar{Y}_{p,CZ} = \mu_{p,CZ} + \bar{\theta}_{p,CZ}$$

Examples of θ :

- Race: Black men from same census tract as white men have worse outcomes (Chetty, Hendren, Jones, and Porter, 2018)
- Differing propensity to invest in children's human capital Examples of $\mu:$
 - · Local public goods, schools, neighborhood quality, peer effects

Reduced upward mobility (\bar{Y}_{p25}) in Great Migration CZs



Results on upward mobility

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- 2. Is the channel family selection $(\bar{\theta})$ or changes in locations (μ) ?

Isolating impact of Great Migration on locations

Ideal experiment:



• Prediction: Adult income A < B.

Isolating impact of Great Migration on locations

Approximating ideal experiment:



• (C-A) > (D-B): Exposure to Detroit worse than to Pittsburgh.

Reduced childhood exposure effects in Great Migration CZs



Robustness



Alternative baseline controls Different versions of the instrument

Contribution of selection vs. location-based channels

Comparing GM impact (IV) on upward mobility for low income families using CZ exposure effects (μ) vs. average upward mobility ($\bar{Y} = \mu + \bar{\theta}$), assuming full childhood exposure.

Multiplier	μ	\bar{Y}
20	-5.1	-3.6
15.52	-3.9	-3.6

- Multiplier adjusts for cumulative effect of full childhood exposure to a location under different assumptions.
 Hockey Stick Visual
- No evidence that selection drives effect of Great Migration.
- -3.9 percentile points $\sim 12\%$ drop in income.

Results on upward mobility

1. Did the Great Migration reduce upward mobility in the North?

- 1 s.d. \uparrow lowered average income rank of individuals from low income families by 3.6 percentiles (\sim 11% \downarrow income)
- Is the channel selection (Δ average child) or changes in locations (e.g., local public goods and neighborhood quality)?
 - Random child growing up in Great Migration CZ has lower income as an adult. 1 s.d. ↑ shock ⇒ 3.9 percentiles ↓ in income rank (~ 12% ↓ income)

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Heterogeneity by gender

- Boys' outcomes more elastic to family and school inputs [Bertrand and Pan (2013); Autor et al. (2016); Autor et al. (forthcoming)]
- Chetty et al. (2018) find no white-Black gap among girls
- Results have implications for racial gap in upward mobility

Contribution of Great Migration to upward mobility gap between Black and white households

Question: What would the racial gap in upward mobility in North be without changes induced by Great Migration?

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Compare average racial gap across northern CZs to counterfactual racial gap with no GM (each CZ receives 1 pctile of shock):

	Parent Income				
	25th pctile	50th pctile	75th pctile		
Observed	12.03	13.45	15.30		
CF w/o GM (se)	9.1 (.13)	9.83 (.14)	11.01 (.20)		
Pct Change	-24%	-27%	-28%		

• Great Migration explains 27% of income gap between Black and white households from median income families.

Results on upward mobility

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 - Random child growing up in Great Migration CZ has lower income as an adult. 1 s.d. ↑ shock ⇒ 3.9 percentiles ↓ in income rank (~ 12% ↓ income)
- 3. Whose upward mobility was affected by the Great Migration?
 - Black men's income upward mobility reduced; possible income effect on Black women.
Alternative explanations for findings on upward mobility

- Increase in southern population and policy preferences
 - White southern migration placebo White Southerners
- Historical legacy of European immigration
 European Immigrants
- Correlated shocks to southern and northern locations

 - Dropping top urban counties Non-top-urban
 - Alternative instruments deliver similar estimates
 Over-ID
- Fixed characteristics of high Black share CZs Expos FX
- Other fixed characteristics of CZs: similar impact on first-differences in Black men's upward mobility • Graph
- Results not driven by any particular CZ

 Leave One Out
- Inference: AKM (2019) placebo shifters Placebo Shocks

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Results on local mechanisms

1. How did the urban environment change in response to the Great Migration?

The Great Migration of poorer Black families from the South caused...

- 1. White flight and income segregation
- 2. Reduced urban economic opportunity \rightarrow higher crime
- 3. Incarceration $\uparrow \rightarrow$ negative spillovers on Black men



Data Source: PF-NBHDS database for CZs, 1920-2015.

→ Highways

► Notes



Data Source: PF-NBHDS database for CZs, 1920-2015.

→ Highways

► Notes



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► Notes



Pretrends test

→ Highways

► Notes

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Results on local mechanisms

- 1. How did the urban environment change in response to the Great Migration?
 - 1 s.d. ↑ Black inflows associated with 0.25 s.d ↑ police expenditures, murder rates, white private school enrollment; 0.52 s.d ↑ incarceration.
- 2. When did the changes occur?
 - Data
 Private School
 White Flight
 Police
 Incarceration
 Murder

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- 2. When did the changes occur?
 - Data
 Private School
 White Flight
 Police
 Incarceration
 Murder
 - 1960s are a turning point for Great Migration cities
 - Riots and racial attitudes
 Riots

 George Wallace

Interpretation of results on local mechanisms

Northern opportunity "meccas" declined especially for Black men.

- Direct negative impact of urban violence on outcomes
- Exposure to crime increases likelihood of committing crimes [Case and Katz, 1991; Damm and Dustmann, 2014; Heller et al., 2017; Sviatschi, 2018]
- Negative externalities of police for Black boys

[Ang, 2018; Legewie and Fagan, 2018]

• Incarceration has long-term negative effects on outcomes

[Johnson, 2009; Dobbie et al., 2018; Liu, 2018]

- Fewer public resources for education spending, which benefits low income families [Jackson et al., 2015]
- Suggestive evidence on likely mediators

 Low Inc

 High Inc
- It's not all sorting: GM ↑ census tract racial gap
 Graph

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Conclusion

- High opportunity areas became opportunity "deserts" in response to Great Migration of Black families from the South.
 Aggregate Effects?
- Location effects are sensitive to shocks to racial composition
- The Migration led to white flight and urban decline post-1960
- 50 years of policing, incarceration, and persistent crime
- Do we need new policies to address racial inequality in cities?

Median annual wages for Black men and women in 1940



Median annual wages of Black men and women by commuting zone in 1940.

Data from IPUMS 1940 Census. 🕒



Geography of Black upward mobility: 1940



Frac. of 14-17 yo Black boys and girls from median educated families (5-8 yrs schl) who have 9-plus years of schooling.

Data from IPUMS, method via Card, Domnisoru, and Taylor (2018). 🕒

Correlation 1940 and 2015 upward mobility (white pop)



Correlation 1940 and 2015 upward mobility (Black pop)



Relationship between 1940 and 2015 mobility measures



Relationship between 1940 and 2015 mobility measures for white families



Histogram of urban Black pop increases, 1940-1970



Northern urban CZs. Data source: 1940 Census and City and County Data Books 1944-1977.

Correlated 1940 characteristics



Correlation between 1940-1970 Black population increases in sample CZs and baseline 1940 characteristics. *Data source*: IPUMS 1940 Census; City and County Data Books, 1944-1977.

Back

Using machine learning in "zero stage" of shift share IV

Estimating southern county net-migration rates for "zero stage" is pure prediction problem.

- Belloni et al. (2011): LASSO selection of variables for first stage in IV
- Initial set of predictors each decade: Boustan (2010) vars, incl. ag. vars and WWII \$
- Tuning parameter chosen optimally through 5-fold CV
- Post-LASSO (OLS with LASSO selected var) prediction of net-migration

Variables selected in 1940

- Percent tenant farms
- Share of the labor force in agriculture
- WWII spending per capita
- Percent acreage in cotton
- Share of the labor force in agriculture \times Tobacco growing state
- Indicator for mining state
- Indicator for mining state \times Share of the labor force in mining

Variables selected in 1950

- Percent tenant farms
- Share of the labor force in agriculture
- WWII spending per capita
- Percent acreage in cotton
- Percent acreage in tobacco
- Indicator for mining state
- Indicator for mining state \times Share of the labor force in mining
- Share of the labor force in mining

Variables selected in 1960

- Percent tenant farms
- Share of the labor force in agriculture
- Indicator for tobacco growing state
- Share of the labor force in agriculture \times Tobacco growing state
- Percent acreage in cotton
- Indicator for mining state
- Indicator for mining state \times Share of the labor force in mining
- Share of the labor force in mining

Where does ID come from in the Great Migration Bartik?

- Shares unlikely to be exogenous: $\mathbb{E}[\tilde{\omega}_{j,CZ} \cdot \varepsilon_{CZ} | \mathbb{X}_{CZ}] \neq 0.$
- Exogenous shocks interacted with many invalid shares as instruments give rise to plausibly exogenous variation.

[Goldsmith-Pinkham et al., 2018; Borusyak et al., 2018; Adao et al., 2018]

- Key threat to ID: correlated shocks to origins and destinations.
 - Results on upward mobility are robust to first residualizing county net-migration rates on southern state FEs.
 - Results robust to dropping top urban counties in the south.
 - Over-identification tests using different constructions of instrument fail to reject null of identical effects.



Insufficient number of county types





Insufficient number of county types

3

Can't rule out correlated origin and destination shocks

Madison, WI Poughkeepsie, NY Saginaw, MI Low Migration **High Migration**

1



2

Sufficient number of county types

3

1









Sufficient number of county types

Idiosyncratic origin variation within destination

3

2

1





Southern Black migrant weights $\frac{m_{jc}^{_{35-40}}}{m_{j}^{_{35-40}}}$ for eight cities



Data from IPUMS 1940 complete count census. Migration weights for \sim 320,000 Black respondents who list southern county of residence in 1935 \neq current county.

First Stage



Selection among Black migrants during GM

- Migrants both positively and negatively selected (Collins and Wanamaker, 2015; Eriksson, 2018)
- Grandparents of 1980s birth cohorts migrated.
- Migrants' children had higher upward mobility than non-migrants' in 1940

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Whose upward mobility was affected by Great Migration?



Units of shock are 30 percentiles. Baseline controls included. Observations are northern commuting zones. *Data source*: Chetty-Hendren et al. (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016). Household income

Histogram of 1935-1940 Black southern migrant education

Black migrants were positively selected in 1940. Median education equivalent to national median (Card et al., 2018).



Histogram of years of schooling of 1935-1940 Black migrants aged 25 and older reporting a southern

county of residence in 1935. Data source: IPUMS 1940 Census. 🔍

Foreign-born white share impact on CZ exposure effects



Baseline controls included. Observations are northern commuting zones. Data source: IPUMS

1910-1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).
Foreign-born white share impact on Black m p25



Foreign-born white share impact on Black m p75



White southern mig impact on CZ exposure effects





White southern mig impact on Black m p25



White southern mig impact on Black m p75



Black state resid mig impact on CZ exposure effects





Black non-urban county mig impact on CZ exposure effects





Alternative instruments and over-id test





Great Migration impact on CZ exposure effects, flexible controls for fraction Black



Baseline controls included. Observations are northern commuting zones. Data source: Chetty and

Hendren (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).



Impact of Great Migration on change in Black men's upward mobility 1940-2015



Results robust to dropping each CZ once from sample

Coefficient on \hat{GM}



Coef. on \hat{GM} using random migration shocks

12% of random shocks generate non-zero effect compared to 45-55% in studies analyzed by AKM (2019).



Baseline controls included. Observations are northern commuting zones. Data source: Chetty et al.

(2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).

Estimates from Chetty and Hendren (2018b): Exposure design purges place effect estimates of bias due to sorting on family unobservables, θ_i :

$$y_i = \delta_c + \theta_i$$

$$\downarrow$$

$$\Delta y_i = \alpha_c \Delta t_i$$

 α_c is an unbiased estimate of effect of additional year of childhood exposure to location c on adult outcome y_i . Back

Details on Chetty-Hendren estimation procedure I

Data and sample definitions

- Universe of individual US tax records from 1996-2012
- 1980s birth cohort children linked to parents through dependent claiming
- Movers sample: \sim 3 mil. families who move once across counties within commuting zones or once across commuting zones.



Details on Chetty-Hendren estimation procedure II

Estimating equation:

$$y_i = \alpha_{od} + \vec{e}_i \vec{\mu} + \varepsilon_i$$

- $\vec{e_i}$ is a vector of exposure times to locations c and $\vec{\mu}$ is a vector of causal exposure effects $\mu_{pc} = \mu_0 + \mu_1 p$
- Assumption 1: Family selection effects constant with respect to child's age at time of move
- Assumption 2: Conditional on origin-destination fixed effects, timing of move is orthogonal to other unobserved factors determining children's outcomes
- Results robust to using displacement shocks and family fixed effects



Causal effects of locations on upward mobility

Let α_c^r be the potential outcome of a low-income child of race r randomly assigned to spend additional year in c, relative to an average place.

By construction,

$$\mathbb{E}[\alpha_c^r] = 0 \implies \mathbb{E}[\tilde{\Delta}_c^{bw}] = \mathbb{E}[\alpha_c^w - \alpha_c^b] = \mathbb{E}[\alpha_c^w] - \mathbb{E}[\alpha_c^b] = 0$$

Replace A_c with α_c . Pack

- Individuals from 1980s birth cohorts from low income families (25th percentile)
- Household income measured at age 26
- Baseline controls included.
- Observations are northern commuting zones.
- Data source: Chetty and Hendren (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).

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Early exposure has smaller impact than teen years

$$\mathsf{Multiplier} = (23 - 13) + (17/40) \cdot 13 = 15.525$$



Calculating effect of full childhood exposure

Assume muted effect for early years:

$$\mathsf{Years} = (23 - 13) + (17/40) * 13 = 15.525$$



- Individuals from 1980s birth cohorts from low income families (25th percentile)
- Household income measured at ages 32-37.
- Baseline controls included.
- Observations are northern commuting zones.
- Units of shock ar 30 percentiles (\approx 1 sd).
- *Data source*: Chetty and Hendren (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).

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- Household income measured at ages 32-37
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- Observations are northern commuting zones.
- Data source: Chetty and Hendren (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).

- Outcome is gap in average adult household income rank between Black and white individuals from median income families.
- Individuals from 1980s birth cohorts
- Household income measured at ages 32-37
- Baseline controls included.
- Observations are northern commuting zones.
- Data source: Chetty and Hendren (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016).

Great Migration largely not associated with pre-1940 mechanisms



Data Source: PF-NBHDS database for CZs, 1920-2015.

Controlling for pre-period murder rates



Data Source: PF-NBHDS database for CZs, 1920-2015.

Substitution out of highway expenditures



Data Source: PF-NBHDS database for CZs, 1920-2015.

- Coefficient on 1 s.d. (30 pctile) Great Migration shock
- Outcomes (years):
 - Average white private school rates (1970-2000)
 - Residential racial and income segregation (2000)
 - Average expenditure shares by government category (1972-2002)
 - Average Murders per 100k (1977-2002)
 - Average incarcerated per 100k (1983-2000)
 - Baseline 1940 controls included
 - Observations are northern commuting zones
 - *Data source*: PF-NBHDS database for CZs, 1920-2015; Chetty et al. (2014)

- Coefficient on 1 s.d. (30 pctile) Great Migration shock
- Outcomes (years):
 - Private school rates (1920)
 - Average murders per 100k (1931-1943)
 - Average local jail rate per 100k (1920-1940)
 - Average expenditure shares and per cap/pupil by government category (1932)
 - Baseline 1940 controls included
 - Observations are northern commuting zones
 - Data source: PF-NBHDS database for CZs, 1920-2015

PF-NBHDS database for CZs, 1920-2015 (1/2)

• Public finance

- Financial statistics of states and local governments, 1932
- City and County Data Books, 1944-1977
- US Census Bureau Annual Survey of Local Governments, 1967-2012
- Private school enrollment rates
 - Biennial Statistics of Education, 1920-22
 - NHGIS, 1960-2010

PF-NBHDS database for CZs, 1920-2015 (2/2)

- Neighborhood quality (cont'd)
 - Murder rates
 - Johnson et al. (2007) city crime rates from Uniform Crime Reports ("UCR"), 1930-1940
 - UCR 1931, 1936, 1943, and 1950
 - ICPSR city crime rates from UCR 1958-1969
 - Vera Institute of Justice In Our Backyards Database
 - City and County Data Books, 1944-1977
 - Incarceration
 - IPUMS Complete Count 1920-1940 Censuses
 - Inmates of Institutions, US Census 1960, Table 52
 - Vera Institute of Justice In Our Backyards Database

I estimate effect of Great Migration shock on mechanisms separately in each year.

$$\mathsf{Mechanism}_{t,CZ} = \alpha + \beta \hat{GM}_{CZ} + \mathbb{X}'_{CZ} \Gamma + \varepsilon_{CZ}$$

- Pre-period years serve as placebo checks or controls
- Scaling: units of shock are 30 percentiles, \sim 1 s.d.

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Great Migration impact on private school enrollment



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year. Units of shock are 30 percentiles. *Data Source*: PF-NBHDS database for CZs, 1920-2015. Plack
Great Migration impact on urban white share



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

Units of shock are 30 percentiles. Controls included for total 1940 CZ population. Data Source: City

and County Data Rooks

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Great Migration impact on police expenditures



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

Great Migration impact on incarceration rates



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

Great Migration impact on incarceration rates (levels)



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

Great Migration impact on murder rates



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

Great Migration impact on fire fighting \$



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.

	Ordinary Least Squares					
	Killed	Arson	Arrests	Days of Riots	Injured	Riots
GM	Per 100k 0.00139	0.0755	0.464	0.0265	0.0967	0.0109
	(0.000605)	(0.0335)	(0.166)	(0.00544)	(0.0351)	(0.00214)
R-squared	0.308	0.440	0.605	0.292	0.461	0.311
	Reduced Form					
\hat{GM}	0.000815	0.0483	0.420	0.00987	0.0769	0.00406
	(0.000544)	(0.0301)	(0.148)	(0.00521)	(0.0314)	(0.00206)
R-squared	0.291	0.429	0.606	0.179	0.455	0.191
	Two-stage least squares					
GM	0.00274	0.163	1.415	0.0332	0.259	0.0137
	(0.00179)	(0.0997)	(0.543)	(0.0159)	(0.110)	(0.00624)
R-squared	0.279	0.409	0.499	0.283	0.368	0.301
Ν	130	130	130	130	130	130
Mean Dep Var	0.0589	4.697	24.91	0.950	4.474	0.413
SD Dep Var	0.162	9.952	58.87	1.437	10.65	0.572
SD GM	28.98	28.98	28.98	28.98	28.98	28.98

TABLE E1: Great Migration CZs experienced more severe 1960s riots

Note: This table reports the satimated impact of the Great Migration on 1960s new risks and risk severity. Dependent variables in columns 15 are individual neurons of the severity of risks, indexing much of individual billed, number of aroun incidents, number of arrets, the duration of the risk in days, and the number of individual billed, number of individual bill columns are normalized by the total C2 population in 1990 and multiplied by 10,000, on they are in per 100,000 of the population units. Independent variable is black population increase between 1990 and 1970. The instrument of black population much is advantated black population increase breaves 1980 and 1970. The instrument of black population much is advantated black population increase breaves 1980 and 1970. The instrument 1952-1940 black southern migrash, educational upward inability, have of black force in numineturing, and ensume threing fixed different southern migrash, educational upward inability, have of black force in numineturing, and ensume threing fixed different southern migrash, educational upward inability, have of black force in numineturing and ensume threing fixed different southern migrash, educational upward inability and columns force in numineturing, and ensume threing fixed different southern migrash, educational upward inability in a southern in much to the southern migrash of excitation 1990. Of the complex band and the southern and have graves the southern and the southern migrash of ensume three in the southern migrash of ensume three in the southern migrash of ensume three in the southern migrash of ensume the southern migrash of ensume three in the southern migrash o

	Ordinary Least Squares			
	Wallace Vote	Wallace Votes		
	Per 1k Voters	Per 1k White Pop		
GM	12.41	4.812		
	(4.058)	(1.713)		
R-squared	0.518	0.514		
	Reduced Form			
\hat{GM}	12.20	4.840		
	(3.642)	(1.536)		
R-squared	0.525	0.521		
	Two-stage least squares			
GM	40.39	16.03		
	(13.87)	(5.771)		
R-squared	0.331	0.343		
Ν	130	130		
Mean Dep Var	58.49	24.17		
SD Dep Var	44.87	18.85		
SD GM	1.000	1.000		

TABLE E2: GREAT MIGRATION AND VOTES FOR GEORGE WALLACE, 1968

Note: This table reports the estimated impact of a constantiated simple static increases in Gran M Bigalain inflows on works for Googe Walkes, pre-supergraduation from generator of Akhana and third-party predicted in the static static static static static static static static static distance in the commuting state. The unit of discration is a voron-minidistance in the commuting state. The unit of discration is a voron-ministatic static static static static static static static static black southern migration alone. A case stated of discration is a static static static static static static static hand static static static static static static static static static population mode up of 1005-1001 hask nonthern migration, chemical statistic static and modeling (2007). Gran Migration data surveys: CODB, 191MM sumplet counts 1004 (2008). CZ-area local government expenditure share is defined as

Pol. Exp. Share_{CZ} = $\frac{\text{Spent on Police by All Local Governments}_{CZ}}{\text{Spent by All Local Governments}_{CZ}}$ Per capita expenditures at the CZ-area level are defined as Per Cap Pol. Exp._{CZ} = $\frac{\text{Spent on Police by All Local Governments}}{\text{Population}_{CZ}}$

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Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year. Units of shock are 30 percentiles. Controls included for total 1940 CZ population. *Data Source*: City and County Data Books. **Back**



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.



Reduced form coefficients of mechanism on Great Migration shock, estimated separately each year.



Sensitivity of coefficient on Great Migration shock to inclusion of intermediate local mechanisms.

Sample: Black men from low income families. Units of shock are 30 percentiles. 🔮



Sensitivity of coefficient on Great Migration shock to inclusion of intermediate local mechanisms.

Sample: Black men from high income families. Units of shock are 30 percentiles. 🖤

Great Migration increased within census tract racial gap



Notes

- Census tract results for 90 CZs for which tract-level gap data available
- Baseline controls included
- Observations are northern commuting zones
- Data source: Chetty et al (2018); IPUMS 1940 Census; City and County Data Books, 1944-1977; and Boustan (2016)

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What was the net effect of the Great Migration?

Things we would need to know:

- Causal effect of Great Migration on upward mobility in South
- Causal effect of Great Migration on (grand)parent income
- Structural relationship between parent income and kid income
- Geographic distribution of Black population before and after

What was the net effect of the Great Migration?

Conjecture: > 0

- Causal effect of Great Migration on upward mobility in South (\geq 0)
- Causal effect of Great Migration on (grand)parent income (>> 0)
- Structural relationship between parent income and kid income Assumed
- Geographic distribution of Black population before and after 1940 \rightarrow 23% N, 77% S 2000 \rightarrow 50% N, 50% S

Intergenerational mobility by race and region



Intergenerational mobility by race and region



Intergenerational mobility by race and region



What was the net effect of the Great Migration?

Why 0.2 percentiles net gain is likely a lower bound:

- Great Migration impact on parent income >> 4 pctiles
- "Voting with one's feet" may have improved the South

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