# Long Shadow of Racial Discrimination: Evidence from Housing Covenants<sup>1</sup>

Aradhya Sood<sup>a</sup> William Speagle<sup>b</sup> Kevin Ehrman-Solberg<sup>c</sup>

<sup>a</sup>University of Toronto

<sup>b</sup>University of Connecticut

<sup>c</sup>Mapping Prejudice

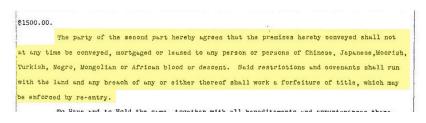
July 12, 2021

**NBER SI** 

<sup>&</sup>lt;sup>1</sup>We thank the Mapping Prejudice Project for sharing their data with us. Also thanks to Kirsten Delegard, Penny Petersen, and Ryan Mattke for their help and contribution in gathering the covenants data. Website: https://www.mappingprejudice.org

#### Introduction

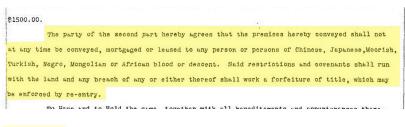
Racial covenants: sale of property to racial minorities prohibited



Other Examples

#### Introduction

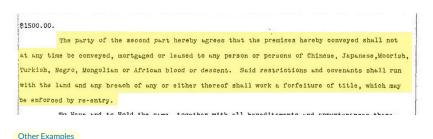
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- Other Examples
- Prevalent throughout cities in the U.S. (1899 on-ward)
  - D.C., Seattle, San Francisco, Philadelphia, Chicago, Minneapolis

#### Introduction

 Racial covenants: sale of property to racial minorities prohibited



- - Prevalent throughout cities in the U.S. (1899 on-ward)
    - D.C., Seattle, San Francisco, Philadelphia, Chicago, Minneapolis
- Legally enforceable until 1948

## This Paper

- Question: Time persistent effects of covenants → present-day socioeconomic geography of Minneapolis, suburbs
  - House Prices (1950 2018)
  - Segregation (2010)

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  - Segregation (2010)

#### - This paper:

- Uses only census data on racial covenants in U.S.
- Regression discontinuity design at 1948 Supreme Court ruling

#### - Findings:

- 3.4% higher 2018 house prices for covenanted lots
- Higher share of covenants in neighborhood  $\rightarrow$  higher home value
- Covenants used in historic lower-middle class neighborhoods
- 1% increase in covenanted houses in census block → 11% reduction in Black residents

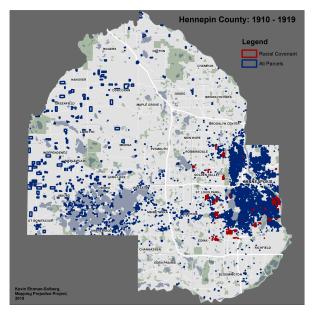
#### Literature Review

- Path dependence: David (1985), Bleakley & Lin (2012), Henderson, Squires, Storeygard, & Wei (2018), Allen & Donaldson (2020), Heblich, Trew, & Zylberberg (2021)
- City structure and externalities: Redding & Strum (2008), Chetty & Hendren (2016), Ahlfeldt, Redding, Sturm, & Wolf (2015)
- Covenants predate these racially discriminatory housing practices:
  - Redlining: Aaronson, Hartley, and Mazumder (2020), Fishback, LaVoice, Shertzer, & Walsh (2020) → HOLC and Covenants
  - Highways: Brinkman & Lin (2017), Baum-Snow (2007)
  - **Zoning:** Shertzer, Twinam, & Walsh (2016), Troesken & Walsh (2019)
- **Preference externality/ Tiebout**: George & Waldfogel (2003), Tiebout (1956), Boustan (2006), Banzhaf & Walsh (2013)

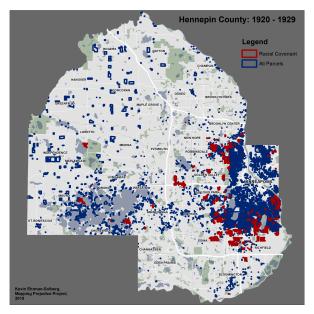
#### **Outline**

- Historical Context for Racial Covenants
- Hypothesis and Mechanisms for Persistent Effects
- Data
- Empirical Strategy
- Results

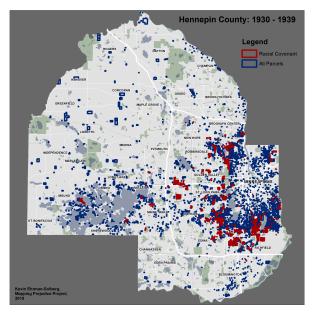
# Racial Covenants in Hennepin County (1910-1919)



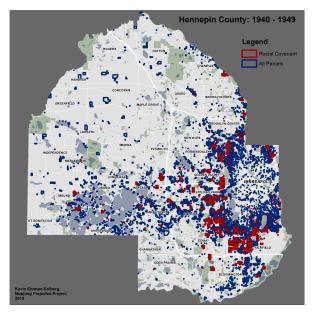
# Racial Covenants in Hennepin County (1920-1929)



# Racial Covenants in Hennepin County (1930-1939)



# Racial Covenants in Hennepin County (1940-1949)



## Historical Context for Racial Covenants (1/2)

- Like all covenants, racial covenants run with land
- Legally enforced until 1948
- Private instrument: individual/group instrument
- Role of developers:
  - Mostly added by developers on newly platted land (94%)
  - Covenants advertised by developers, creating "amenity"



## Historical Context for Racial Covenants (2/2)

- Covenants and Twin Cities:
  - Data available for Hennepin
  - Ideal setting: no racial zoning, city fast expanding, precedes HOLC and highways
- Covenants and other housing policies:
  - Supreme Court upheld legality of racial covenants in 1926
  - Redlining/HOLC maps (1935): Top ratings only if covenants in area Redlining
  - Discrimination for FHA loans (1936 FHA underwriting manual)
    - Preferred candidate for loans if house covenanted

## Potential effects of Racial Covenants: Past and Present

- Racial covenants on past outcomes:
  - Racial composition: by design African American Population 1910-1940
  - House prices: higher prices for "all white amenity"

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- Racial covenants on racial composition over time (endogenous location amenity)
  - 1. Public investment: parks (lakes), highways, schools Hways Lakes
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- Effects of racial covenants on house prices over time:
  - 1. Public investment
  - 2. Sorting
  - 3. Difference in house quality, investment over time

## Data (1/2)

#### 1. Mapping Prejudice data

- Complete census of covenanted deeds in Hennepin County
- About 3 million warranty pages analyzed (1900-1960)
- 16,986 of 156,970 extant houses have covenants (1910-1949)
- Date of covenant execution and specific racial restrictions

#### 2. Tax assessor + Zillow

- Assessed values (2017-18): marked to market, yearly home visits
- House characteristics (e.g. bedrooms, bathrooms, parcel and built area, roof type)

#### 3. Historic house prices:

- Mortgage documents [1945-1951]: 1709 random houses
- Sales prices: 2001-2005

## Data (2/2)

- 4. Neighborhood characteristics:
  - Census 2010. ACS 2018
  - Geocoded, digitized 1940 Enumeration District (E.D.) boundaries
  - Minneapolis + 10 suburbs (90% of houses [1945-1952])
- Public Amenities and Investments:
  - Distance to lakes (parks), highways
  - Elementary school attendance boundaries

Baseline sample: 24,700 extant homes with 2,678 covenanted lots [1945-1952] 

Baseline Sample Map

Summary Stats

## **Empirical Strategy**

- Study causal impact of covenants on socioeconomic outcomes in and around Minneapolis today
- Analysis at two levels:
  - Individual lot level: house prices
  - Census block level: neighborhood racial composition, home ownership by race
- Key variable of interest: covenanted lot, share of covenanted lots in 100-500m radius around house, share of census block with covenanted lots
  - Treatment: covenanted lots
  - Control: not-covenanted lots

# **Empirical Model for House Prices**

$$\log Y_{ijt} = \alpha_0 + \alpha_1 \mathbb{1} \{ \cos_{js} \} + \beta_1 X_{jt} + \beta_2 X_{it} + \theta_{\eta_i} + \epsilon_{ijt}$$

- j = individual house, t = 2018
- Y: Log of assessed house values (2018)
- $\mathbb{1}\{cov_{is}\}$ : Dummy for a house j covenanted in past period s
- $X_{it}$  house characteristics,  $X_{it}$  Census block/tract controls
- $\theta_i$  neighborhood fixed effects: Census Block Group
  - Compare treated houses with non-treated within same neighborhood

## Regression Discontinuity Time

- Endogeneity: Likelihood of having racial covenants could be correlated with unobserved location quality
- Strategy: RD in time
  - Exploit the 1948 U.S. Supreme court ruling: made racially restrictive covenants unenforceable
  - Compare houses built right before and after 1948 ruling
  - Houses built < 1949 had positive probability of enforced covenants</li>
  - Houses built > 1948 had zero probability of enforced covenants
  - Avoid historical trends: restrict analysis to houses built
    - 1945-1952, 1945-1954 → Houses Built (1900-2018)

## 1948 SC Ruling as Instrument

- SC ruling is correlated with probability of having a covenant
  - $\leq$  1948-racial covenants legal & probable
  - > 1948-illegal & improbable
- Unobservable location quality of houses built right before and right after 1948 not correlated with present day houses prices
  - Comparing houses/blocks within neighborhood
  - City expanding outward: farmland  $\rightarrow$  residential
- "Randomness" of SC ruling:
  - 1948 ruling was not anticipated
  - 1926 US SC ruling upheld legality of racial covenants (Rose, 2015)

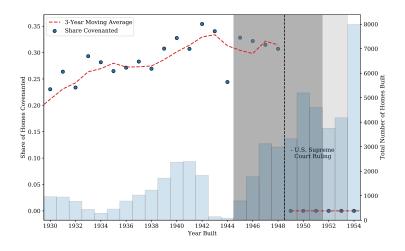
# Effect of 1948 Ruling on Non-White Homeownership

- Use surname-race bayesian routine to identify race (1709 mortgage documents)
- Use 1940 Census names
- Undercounting (Dahis, Nix & Qian, 2020)

| Time Period           | \\/bito | Black | Othor | Black        | Black        | Black |
|-----------------------|---------|-------|-------|--------------|--------------|-------|
| Time Period           | vviiite | DIACK | Other | Conventional | entional FHA |       |
| ≤ 1948 Covenanted     | 224     | 1*    | 1     | 0            | 1            | 0     |
| > 1948 Non-Covenanted | 434     | 3     | 0     | 2            | 0            | 1     |
| Homes Built 1949-51   | 1031    | 14    | 1     | 4            | 5            | 5     |

**Note:** 1\* references two individuals with identical names in the United States. One White individual from Illinois and a Black from Georgia.

## Regression Discontinuity on Covenant Deeds



## Fuzzy RD-IV for House Prices

- j = individual house and i = 2010 census block group
- s = 1945 1952 (or sub-sample)

$$\begin{split} \log \mathsf{Y}_{ijt} &= \alpha_0 + \alpha_1 \mathbf{1} \{ \mathsf{cov}_{js} \} + \beta_1 \mathsf{X}_{jt} + \beta_2 \mathsf{X}_{it} + \theta \eta_i + \epsilon_{ijt} \\ \mathbf{1} \{ \mathsf{cov}_{js} \} &= \gamma_0 + \gamma_1 \mathbf{1} \{ \mathsf{pre1949}_{ej} \} + \mathsf{f}(\mathsf{Date}_s) + \beta_2 \mathsf{X}_{es} + \eta_e + \epsilon_{ejs} \end{split}$$

- Instrument: Dummy for house built right  $\leq 1948 \{pre1949_{ej}\}$ 
  - $\gamma_1$ : probability of enforceable covenant
- f(Date<sub>s</sub>): nth-order polynomial in time, estimated flexibly

Control variables

## RD-IV at Neighborhood Level (1/2)

$$Y_{it} = \alpha_0 + \alpha_1\%cov_{is} + \beta_1X_{it} + \theta\eta_i + \epsilon_{it}$$

- Y<sub>it</sub>: Arcsinh percent home ownership by race, Arcsinh percent resident population by race in block i
- %cov<sub>is</sub>: Arcsinh percent houses covenanted within census block
  - Consider blocks with 75-100% houses built 1945-1951
- Arcsinh: inverse hyperbolic sine transformation ▶ Arcsinh-Log Plot
  - Non-normal distribution; meaningful zeros in dependent and independent variables
  - Similar to log of variable, allows retaining zero-valued observations

## RD-IV at Neighborhood Level (2/2)

$$\begin{aligned} & \textcolor{red}{\textbf{Y}_{\textit{it}}} = \alpha_0 + \alpha_1 \% \text{cov}_{\textit{is}} + \beta_1 \textcolor{black}{\textbf{X}_{\textit{it}}} + \theta \eta_{\textit{i}} + \epsilon_{\textit{it}} \\ \% \text{cov}_{\textit{is}} &= \gamma_0 + \gamma_1 \% \text{built}_{\textit{is}} + \textit{f}(\textit{Date}_{\textit{s}}) + \beta_1 \textcolor{black}{\textbf{X}_{\textit{es}}} + \eta_e \epsilon_{\textit{es}} \end{aligned}$$

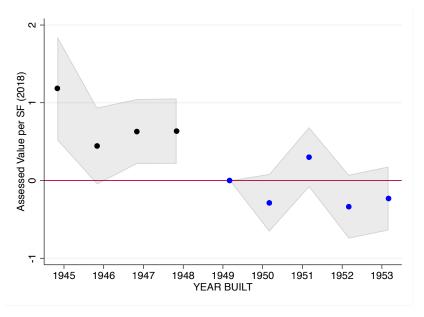
- %cov<sub>is</sub>: Arcsinh percent houses covenanted within census block
- %built<sub>is</sub>: Percent houses built ≤ 1948 within census block
- Neighborhood FE: compare Census blocks within tracts

#### Externalities:

- Endogenous: share covenants in 100-500 meter radius around house
- Instrument: share houses ≤ 1948 in 100-500 meter radius around house

# Results

# House Value per Square Feet and Year Built



|                         | OLS       | First-Stage     |
|-------------------------|-----------|-----------------|
|                         | (I)       | (II)            |
| Dep. Var.               | Log House | Covenanted      |
|                         | Value     | CC. C. Idi ited |
| Covenanted              | 0.009     |                 |
| Covenanteu              | (0.005)   |                 |
| D                       |           | 0.308***        |
| Dummy built 1948        |           | (0.082)         |
| 1940 region FE          | N         | ED              |
| 2010 region FE          | BG        | N               |
| Housing Characteristics | Υ         | N               |
| 1940 Census Controls    | N         | Υ               |
| Clarate NA/Inita        | 0.520***  |                 |
| Share White             | (0.011)   |                 |
| 2010 Census Controls    | Υ         | N               |
| Clustered S.E.          | Block     | ED              |
| Observations            | 24,182    | 25,389          |
| R-sq                    | 0.856     | 0.297           |

| <del></del> ,           | (I)<br>Log House | (11)        | (111)     |  |
|-------------------------|------------------|-------------|-----------|--|
|                         | og House         |             | ` '       |  |
| Dep. Var.               | Log House        | Covenanted  | Log House |  |
| Dep. var.               | Value            | Coverianteu | Value     |  |
| Covenanted              | 0.009            |             | 0.034*    |  |
| Covenanted              | (0.005)          |             | (0.014)   |  |
| Dummy built 1948        |                  | 0.308***    |           |  |
| Dunning built 1748      |                  | (0.082)     |           |  |
| 1940 region FE          | N                | ED          | ED        |  |
| 2010 region FE          | BG               | N           | BG        |  |
| Housing Characteristics | Υ                | Ν           | Υ         |  |
| 1940 Census Controls    | Ν                | Υ           | Υ         |  |
| Share White             | 0.520***         |             | 0.124***  |  |
| Share write             | (0.011)          |             | (0.014)   |  |
| 2010 Census Controls    | Υ                | Ν           | Υ         |  |
| Clustered S.E.          | Block            | ED          | Block     |  |
| Observations            | 24,182           | 25,389      | 24,182    |  |
| R-sq                    | 0.856            | 0.297       | 0.856     |  |

|                         | OLS       | First-Stage | RD-IV     | RD-IV     |  |
|-------------------------|-----------|-------------|-----------|-----------|--|
|                         | (1)       | (11)        | (111)     | (IV)      |  |
| Dep. Var.               | Log House | Covenanted  | Log House | Log House |  |
|                         | Value     | Covenanteu  | Value     | Value     |  |
| Covenanted              | 0.009     |             | 0.034*    | 0.029*    |  |
|                         | (0.005)   |             | (0.014)   | (0.014)   |  |
| Dummy built 1948        |           | 0.308***    |           |           |  |
|                         |           | (0.082)     |           |           |  |
| 1940 region FE          | N         | ED          | ED        | ED        |  |
| 2010 region FE          | BG        | N           | BG        | BG        |  |
| Housing Characteristics | Υ         | N           | Υ         | Υ         |  |
| 1940 Census Controls    | N         | Υ           | Υ         | Υ         |  |
| Share White             | 0.520***  |             | 0.124***  |           |  |
|                         | (0.011)   |             | (0.014)   |           |  |
| 2010 Census Controls    | Υ         | N           | Υ         | Υ         |  |
| Clustered S.E.          | Block     | ED          | Block     | Block     |  |
| Observations            | 24,182    | 25,389      | 24,182    | 24,182    |  |
| R-sq                    | 0.856     | 0.297       | 0.856     | 0.855     |  |

|                         | OLS       | First-Stage | RD-IV     | RD-IV     | Reduced-Form |
|-------------------------|-----------|-------------|-----------|-----------|--------------|
|                         | (1)       | (11)        | (111)     | (IV)      | (V)          |
| Dep. Var.               | Log House | Covenanted  | Log House | Log House | Log House    |
|                         | Value     | Coverianted | Value     | Value     | Value        |
| Covenanted              | 0.009     |             | 0.034*    | 0.029*    |              |
|                         | (0.005)   |             | (0.014)   | (0.014)   |              |
| Dummy built 1948        |           | 0.308***    |           |           | 0.016***     |
|                         |           | (0.082)     |           |           | (0.005)      |
| 1940 region FE          | N         | ED          | ED        | ED        | N            |
| 2010 region FE          | BG        | N           | BG        | BG        | BG           |
| Housing Characteristics | Υ         | N           | Υ         | Υ         | Υ            |
| 1940 Census Controls    | N         | Υ           | Υ         | Υ         | Υ            |
| Share White             | 0.520***  |             | 0.124***  |           | 0.114***     |
|                         | (0.011)   |             | (0.014)   |           | (0.014)      |
| 2010 Census Controls    | Υ         | N           | Υ         | Υ         | Υ            |
| Clustered S.E.          | Block     | ED          | Block     | Block     | Block        |
| Observations            | 24,182    | 25,389      | 24,182    | 24,182    | 24,182       |
| R-sq                    | 0.856     | 0.297       | 0.856     | 0.855     | 0.856        |

### **Results: Discussion**

#### OLS underestimates the effect of racial covenants:

- Unobserved location quality negatively correlated with probability of being covenanted 

  Buffer Zones
- Better locations: price, other mechanisms keep out minorities
- Covenants added in swamp location (Almagro & Sood, 2021)
  - 1% increase in hydric soils (swamp indicator), 2-3.4% increase in likelihood of covenanted lot
- Consistent with amenity-income persistence theory (Lee & Lin, 2017)
- Covenants keeping African Americans out of lower-middle/middle/working class neighborhoods

#### **RD-IV** and Mechanisms for Persistance

|                | (1)       | (11)    | (III)     | (IV)     | (V)       | (VI)      |
|----------------|-----------|---------|-----------|----------|-----------|-----------|
| Covenanted     | -0.061*   | 0.034*  | 0.036*    | 0.037**  | 0.025     | 0.030*    |
| Coverianteu    | (0.024)   | (0.014) | (0.015)   | (0.014)  | (0.015)   | (0.015)   |
| Share White    | -0.481*** | 0.12*** | 0.124***  | 0.121*** |           | 0.133***  |
| Share wille    | (0.028)   | (0.014) | (0.014)   | (0.014)  |           | (0.014)   |
| Highways       |           |         | 0.147***  |          | 0.158***  | 0.154***  |
| Highways       |           |         | (0.017)   |          | (0.017)   | (0.017)   |
| Highways-sq    |           |         | -0.040*** |          | -0.044*** | -0.043*** |
| i ligilways-sq |           |         | (0.007)   |          | (0.007)   | (0.007)   |
| Water          |           |         |           |          | -0.085*** | -0.081*** |
| vvatei         |           |         |           |          | (0.010)   | (0.010)   |
| Schools        | Ν         | Ν       | N         | Υ        | Υ         | Υ         |
| 1940 region FE | ED        | ED      | ED        | ED       | ED        | ED        |
| 2010 region FE | N         | BG      | BG        | BG       | BG        | BG        |
| Housing Char.  | Υ         | Υ       | Υ         | Υ        | Υ         | Υ         |
| 1940 Controls  | Υ         | Υ       | Υ         | Υ        | Υ         | Υ         |
| 2010 Controls  | Υ         | Υ       | Υ         | Υ        | Υ         | Υ         |
| Clustered S.E. | Block     | Block   | Block     | Block    | Block     | Block     |
| Observations   | 24,182    | 24,182  | 23,872    | 24,182   | 24,182    | 23,872    |
| R-sq           | 0.695     | 0.856   | 0.858     | 0.857    | 0.859     | 0.862     |

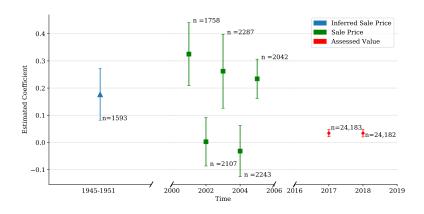
#### Robustness

- "Donut" RD [1945-47, 1950-52]:
  - Avoids short-run selection issues: 0.031 (0.008) → Donut
- Different bandwidth:
  - 1945-1954: 0.037 (0.012)
  - 1946-1951: 0.023 (0.016) ▶ Bandwidth
- Balance checks in housing characteristics Balance Checks
- Placebo RD, anticipation effects 1947 cut-off: 0.005 (0.012)
   ▶ 1947 Cut-off
- After effects 1949 cut-off: 0.037 (0.011) ▶ 1949 Cut-off

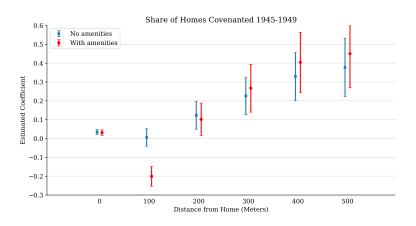
#### **Covenants and Past House Prices**

- Random sample of 1709 properties, preserving share covenants [1945-1951]
  - Mortgage documents: terms, names of mortgagee
    - Type of mortgage: conventional, Veteran Affairs (VA) or G.I. Bill, Federal Housing Authority (FHA)
  - Estimate prices with down payment based on type of mortgage
    - 10-20% down payment for VA, FHA
    - 20% down payment for conventional loans
- 2. Sales prices [2001-2005]
  - Not a random sample of houses

#### Value of Covenants over Time



#### **Externalities from Covenants**



#### **Covenants and Neighborhoods**

- Covenants shape demographics of neighborhoods today:
  - Affects where Black and non-White/non-Black residents live
  - 1% increase in share covenanted lots in Census blocks:
    - 11% ↓ Black residents
    - 13% ↓ non-White and non-Black residents
- Covenants shape home ownership in 21st century:
  - Affect Black home ownership location (1% increase 18% fall)
  - No effects on home ownership rate or ownership by other minorities
  - No effects on rental location across races

#### Conclusion

- Document persistent causal effects of racial covenants in and around Minneapolis on:
  - Higher property values on covenanted lots († 3.4% in 2018)
  - Covenanted lots in previously lower amenity regions: keeping African Americans out of lower-middle and middle class (blue collar neighborhoods)
  - Larger the share of neighborhood covenants, higher house values
  - Location of Black residents (↓ 11% in 2010)
- Implications for racial wealth gap and mobility

# Thank you! aradhya.sood@utoronto.ca william.speagle@uconn.edu

## **Appendix**

#### **Covenant Deeds Examples**

. DE GOUE CUELEOU MUTOU MAY DE OL DECOME SU SUNOYSUCE OL METEMOE DO SUE METEMOCLUCOS.

(e) No race or nationality other than the Caucasian Race shall use or occupy any building on any lot, except that this covenant shall not prevent occupancy by domestic servants of a different race or nationality employed by an owner or tenant.

the title merein in the vendors, their meirs or assigns, als heirs, executors, administrators, or assigns, agrees not to i premises to be occupied by persons of African or Semitic t thereof on file and of record in the office of the Register unty of Hennepin and State of Minnesota.

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#### **IV** Test

#### Table: Tests for Valid Instruments

Tests of endogeneity
Ho: variables are exogenous

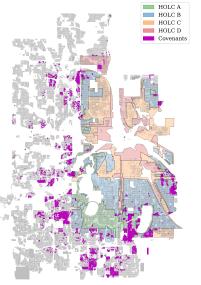
Robust regression F(1,1776) = 13.926 (p = 0.0002) (Adjusted for 1777 Census Blocks Clusters)

### Shea's partial R-squared 0.1826

This table presents the valid instruments tests for the IV regressions. The endogenous variable is a dummy for a covenanted house and the instrument is a dummy for house being built before 1949. The analysis is restricted to [1945-1951]. The data comes from census (1940, 1950, 2010), ACS(2010), Hennepin county tax assessor data, and the Mapping Prejudice project.

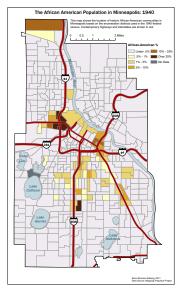
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#### **HOLC Grades and Covenants**



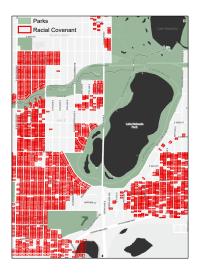
Note: This figure presents covenanted lots and HOLC grades. Purple: covenanted lots, Green: Grade A, Blue: Grade B, Yellow: Grade C, Red: Grade D

#### African-American Population and Highway Location





#### Racial Covenants and Amenities-Lake Nokomis



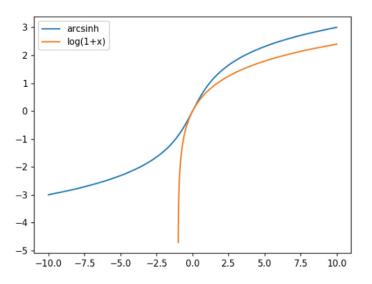
#### Fuzzy RD-IV: Controls

$$\begin{split} \log \mathsf{Y}_{ijt} &= \alpha_0 + \alpha_1 \mathbf{1} \{ \mathsf{cov}_{js} \} + \beta_1 \mathsf{X}_{jt} + \beta_2 \mathsf{X}_{it} + \theta \eta_i + \epsilon_{ijt} \\ \mathbf{1} \{ \mathsf{cov}_{js} \} &= \gamma_0 + \gamma_1 \mathbf{1} \{ \mathsf{pre1949}_{ej} \} + f(\mathsf{Date}_s) + \beta_2 \mathsf{X}_{es} + \eta_e + \epsilon_{ejs} \end{split}$$

- House characteristics: parcel area (sq feet), built area (sq feet), number of floors, bedrooms, bathrooms, heating, roof type, construction type
- X<sub>es</sub> 1940s enumeration district e characteristics: median household income, population density, ownership rate
- $\eta_e$  enumeration district fixed effects
- Neighborhood characteristics (2010): block population density, share of residents above 18, median income, share white

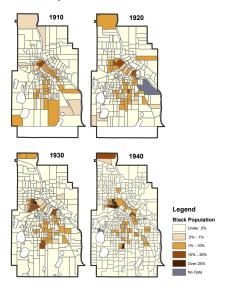


#### **Arcsinh and Log**



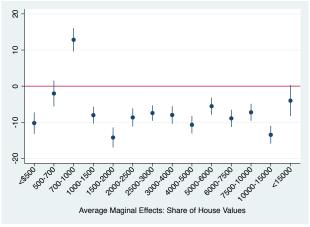


#### African American Population 1910-1940





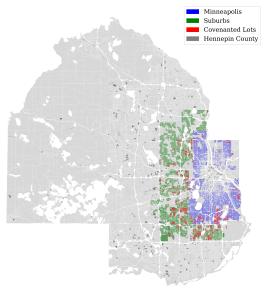
#### Covenants as Buffer Zones



Marginal effects from Logit specification on probability to write a covenant between 1940-48. Independent variable is share of houses with values between ranges in 1940 Census.



#### Our Sample: Houses Built [1945-54]



#### Stylized Model of Time Persistent Effects

- Mechanism for long-term effect of covenants on neighborhood sorting and house price differentials
  - Time persistent effect arises out of endogenous amenity location
- Initial racial sorting in neighborhoods by covenants
- Post 1948 or 1968 (Fair Housing Act):
  - Revert to symmetric distribution by across neighborhoods

#### Toy Model of Time Persistent Effects

- j discrete locations in a city
- Residents choose neighborhood at time t to maximize:

$$V(j,t) = A(j,t)c(j,t)$$
 s.t.  $c(j,t) + R(j,t) = I$ 

- c: consumption, R: rent, I: income
- Amenity of neighborhood: A(j, t) = a(j) + d(j, t)
- a: natural amenity
- d: endogenous amenity
  - Changes over time

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#### **Endogenous Amenity**

Endogenous amenity follows AR1 process

$$d(j,t) = (1 - \delta)d(j,t-1) + e(j,t) - b(j,t)$$

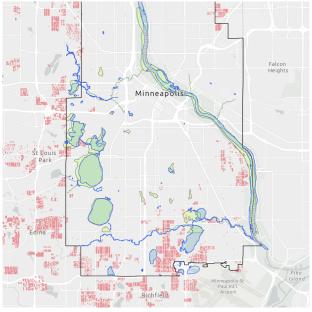
- e(j, t) is increasing in I: higher average incomes increase attractiveness
- b(j, t): if share of non-white population falls below threshold → dis-amenity
- Without *e*(.) or *b*(.) channels, reversion to symmetric distribution
- If initial segregation by covenants caused *e* or *b* amenity perturbation to operate:
  - Sorting of neighborhoods across income and race will persist

#### 1913 Newspaper Add





#### Old and New Lakes



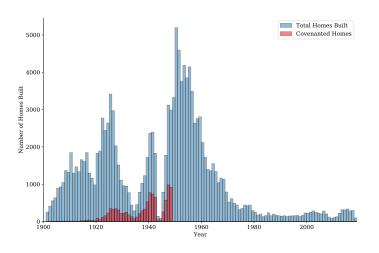
#### Summary Statistics 1945-1952

| 1945-1952             | Non-covenanted    | Covenanted        |  |
|-----------------------|-------------------|-------------------|--|
| Total Home Value      | 274,164 (151,350) | 293,503 (163,801) |  |
| Parcel Sq. Ft.        | 8,633 (10,712)    | 8,425.53 (4,402)  |  |
| Building Area Sq. Ft. | 1,181 (862)       | 1,227 (414)       |  |
| Bedrooms              | 2.99 (0.80)       | 3.07 (0.80)       |  |
| Bathrooms             | 1.47 (0.66)       | 1.49 (0.65)       |  |
| 2010 Med. HH Income   | 86,551 (32,255)   | 95,796 (34,137)   |  |
| 2010 Share 18+        | 0.78 (0.08)       | 0.77 (0.08)       |  |
| 2010 Share White      | 0.82 (0.17)       | 0.87 (0.12)       |  |
| 2010 Population       | 62.96 (63.99)     | 62.71 (53.34)     |  |
| Share of Total        | 89.15%            | 10.84%            |  |
| Observations          | 22,022            | 2,678             |  |

Note: This tables summary statistics. The variables House Value and Year Built are from Hennepin County Tax Assessor data. Housing characteristics is from ZTrax. House Value is for 2018. Variables on income is from 2010 Census and the share of races is from 2010-2014 ACS estimates.



#### Houses Built in Hennepin County (1900-2018)





#### **Balance Checks**

|                | 1945-1952 | 1945-1954 |
|----------------|-----------|-----------|
| Lot SF         | 508.5     | -332.6    |
| LUI 3F         | (300.2)   | (464.2)   |
| Built SF       | 105.8*    | 62.72     |
| Duiit Si       | (51.27)   | (37.65)   |
| Bedrooms       | -0.074    | 0.015     |
| Deditionis     | (0.066)   | (0.058)   |
| Bathrooms      | 0.168***  | 0.167***  |
| Datilioonis    | (0.045)   | (0.040)   |
| No. of Stories | -0.045*   | -0.090*** |
| No. of Stories | (0.022)   | (0.020)   |
| Nearest Water  | -15.19    | -2.238    |
|                | (22.37)   | (22.40)   |
|                |           |           |



#### RD-IV: 1947 and 1949 Cut-Offs

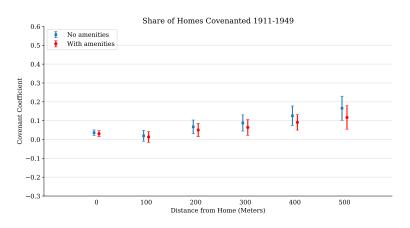
|                         | RD-IV (1947 Cutoff) | RD-IV (1949 Cutoff) |  |
|-------------------------|---------------------|---------------------|--|
| Dep. Var.               | Log House           | Log House           |  |
| Дер. vai.               | Price               | Price               |  |
|                         | 0.005               | 0.007***            |  |
| Covenanted              | 0.005               | 0.037***            |  |
| 201011011000            | (0.012)             | (0.011)             |  |
| 1940 region FE          | ED                  | ED                  |  |
| ED                      | ED                  |                     |  |
| 2010 region FE          | BG                  | BG                  |  |
| BG                      | BG                  |                     |  |
| Housing Characteristics | Υ                   | Υ                   |  |
| 1940 Census Controls    | Υ                   | Υ                   |  |
| 2010 Census Controls    | Υ                   | Υ                   |  |
| Clustered S.E.          | Block               | Block               |  |
| Observations            | 31,897              | 31,682              |  |
| R-sq                    | 0.857               | 0.858               |  |

#### RD-IV: Different Bandwidths and Donut RD

|                         | 1945-1954 | 1946-1951 | 1947-1950 | Donut     |
|-------------------------|-----------|-----------|-----------|-----------|
|                         | (1)       | (11)      | (111)     | (IV)      |
| Dep. Var                | Log House | Log House | Log House | Log House |
| Dep. vai                | Value     | Value     | Value     | Value     |
| Covenanted              | 0.037**   | 0.023     | -0.003    | 0.030***  |
| Covenanteu              | (0.012)   | (0.016)   | (0.018)   | (0.008)   |
| 1940 region FE          | ED        | ED        | ED        | ED        |
| 2010 region FE          | BG        | BG        | BG        | BG        |
| Housing Characteristics | Υ         | Υ         | Υ         | Υ         |
| 1940 Census Controls    | Υ         | Υ         | Υ         | Υ         |
| 2010 Census Controls    | Υ         | Υ         | Υ         | Υ         |
| Clustered S.E.          | Block     | Block     | Block     | Block     |
| Observations            | 31,682    | 19,926    | 13,897    | 18,167    |
| R-sq                    | 0.858     | 0.858     | 0.885     | 0.855     |

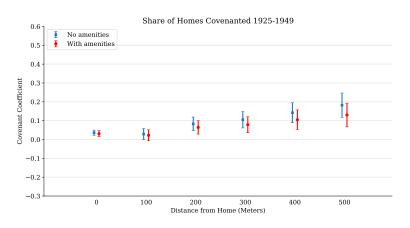
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#### Externalities from Covenants (1911-1948)



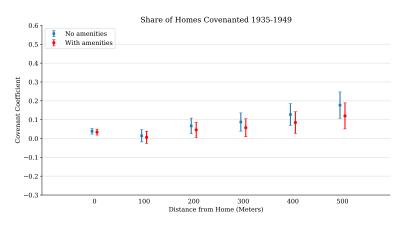


#### Externalities from Covenants (1925-1948)





#### Externalities from Covenants (1935-48)





#### Redlining and Covenants

| Covenanted              | 0.067     |
|-------------------------|-----------|
| Coverianted             | (0.053)   |
| HOLCB                   | -0.050*   |
| HOLEB                   | (0.023)   |
| HOLC C                  | -0.072**  |
| HOLEC                   | (0.024)   |
| HOLC D                  | -0.096**  |
| HOLE D                  | (0.034)   |
| Highways                | 0.187***  |
| Tilgilways              | (0.037)   |
| Highway-sq              | -0.056*** |
| riigiiway 3q            | (0.012)   |
| Water                   | -0.172*** |
| VVatci                  | (0.019)   |
| Schools                 | Υ         |
| 1940 region FE          | ED        |
| 2010 region FE          | BG        |
| Housing Characteristics | Υ         |
| 1940 Census Controls    | Υ         |
| 2010 Census Controls    | Υ         |
| Clustered S.E.          | Block     |
| Observations            | 6,176     |
| R-sq                    | 0.921     |
|                         |           |

#### Covenants and Resident Population by Race (2010)

|                    | First-Stage<br>(I)     | IV<br>(II)        | IV<br>(III)       | IV<br>(IV)            | IV<br>(V)                          |
|--------------------|------------------------|-------------------|-------------------|-----------------------|------------------------------------|
| Dep. Var.          | Arcsin %<br>Covenanted | Arcsin %<br>Black | Arcsin %<br>White | Arcsin %<br>Non-White | Arcsin %<br>Non-White<br>Non-Black |
| Arcsin % Cov.      |                        | -0.111***         | 0.066***          | -0.149***             | -0.129***                          |
| 7 ti esii 170 Cov. |                        | (0.024)           | (0.012)           | (0.024)               | (0.025)                            |
| Built %            | 0.0003***              |                   |                   |                       |                                    |
| Built 70           | (0.0000)               |                   |                   |                       |                                    |
| Elasticity         | 1.798***               |                   |                   |                       |                                    |
| Liasticity         | (0.062)                |                   |                   |                       |                                    |
| 1940 region FE     | ED                     | N                 | Ν                 | N                     | N                                  |
| 2010 region FE     | N                      | Tract             | Tract             | Tract                 | Tract                              |
| 1940/50 Controls   | Υ                      | Υ                 | Υ                 | Υ                     | Ν                                  |
| 2010 Controls      | Ν                      | Υ                 | Υ                 | Υ                     | Υ                                  |
| Clustered S.E.     | ED                     | Block Group       | Block Group       | Block Group           | Block Group                        |
| Observations       | 7,913                  | 7,776             | 7,776             | 7,776                 | 7,779                              |
| R-sq               | 0.279                  | 0.480             | 0.563             | 0.405                 | 0.274                              |

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# Covenants and Home Ownership Rates (2010) [Minneapolis]

|                         | Arcsinh %      | Arcsinh %   | Arcsinh %      |
|-------------------------|----------------|-------------|----------------|
| Dependent Var.          | ownership      | ownership   | ownership      |
|                         | (II) All races | (III) Black | (IV) Non-white |
| Arcsinh % homes         | -0.025         | -0.189***   | 0.086          |
| covenanted              | (0.018)        | (0.058)     | (0.069)        |
| Percent of homes        |                |             |                |
| built <= 1948           |                |             |                |
| 1940 Region FE          | ED             | ED          | ED             |
| 2010 Region FE          | Tract          | Tract       | Tract          |
| 1940/50 Census controls | Υ              | Υ           | Υ              |
| 2010 Census Controls    | Υ              | Υ           | Υ              |
| Clustered SE            | Block          | Block       | Block          |
| Observations            | 1,772          | 1,772       | 1,772          |
| R-sqr                   | 0.699          | 0.601       | 0.570          |
|                         |                |             |                |

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