

# Credible Interval Estimates of the Size and Legal Composition of the US Foreign-Born Population

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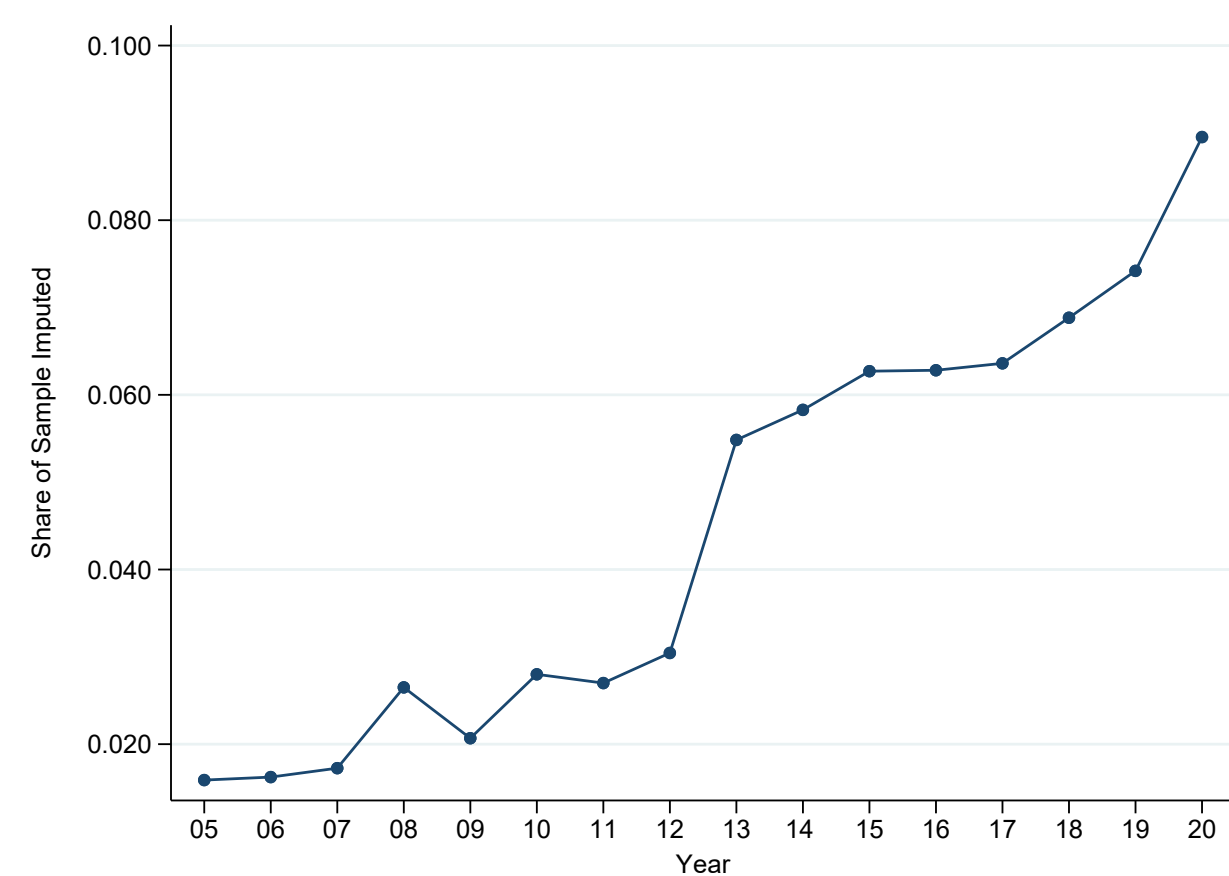
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## Motivation and Contribution

### Motivation:

- There has been a sharp increase in nonresponse to the citizenship question over the years
- This rise in nonresponse degrades survey quality and estimates from those surveys
- Current point estimates assume non-respondents have the same legal status distribution as respondents
- Missing at Random (MAR) assumption is a strong assumption in this context**

Figure 1. Citizenship Question in 2019 ACS



### Research Question:

What is the size and legal composition of the US Foreign-Born Population taking into account non-sampling error?

### Contribution:

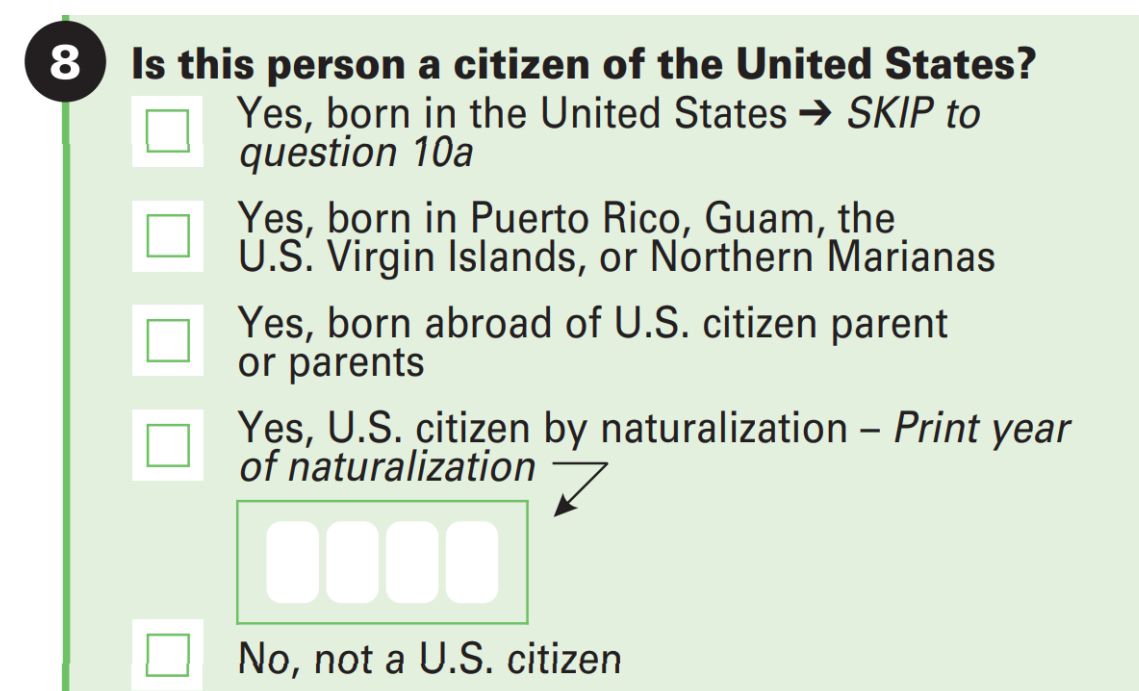
- First to measure total uncertainty in population estimates caused by non-sampling error from item nonresponse.

## Data

### American Community Survey (ACS) 1-Year:

- Main survey used to produce population estimates of the size and legal composition of the US foreign-born population
- Nationally representative samples of 1% of households.
- Asks individuals whether they are native-born, naturalized citizens, or non-citizens
- Use Public Files from IPUMS

Figure 2. Citizenship Non-response rates in the ACS



## Identifying Undocumented Immigrants in the ACS

- Residual Method proposed by Borjas and Cassidy (2019)
- Assign all immigrant women as having authorized status if:
  - that person arrived before 1980;
  - that person is a citizen;
  - that person receives Social Security benefits, SSI, Medicaid, Medicare, or Military Insurance;
  - that person is a veteran, or currently in the Armed Forces;
  - that person works in the government sector;
  - that person was born in Cuba;
  - that person's occupation requires some form of licensing (such as physicians, registered nurses, and lawyers);
  - that person's spouse or parent is a legal immigrant or citizen.
- All individuals not identified as a legal immigrant (the residual) are classified as unauthorized.

## Missing at Random Assumption

### Key underlying assumption: Nonresponse is conditionally random

- The distribution of legal status among respondents is the same as that of respondents
- Untested: We do not know the true distribution of non-responding population

### Procedure: 'Hot-Deck' Imputation

- A non-respondent is assigned citizenship status based on status of respondent
- Conditional on observables: age, race, and ethnicity, location

Figure 3. Foreign-Born Hispanics

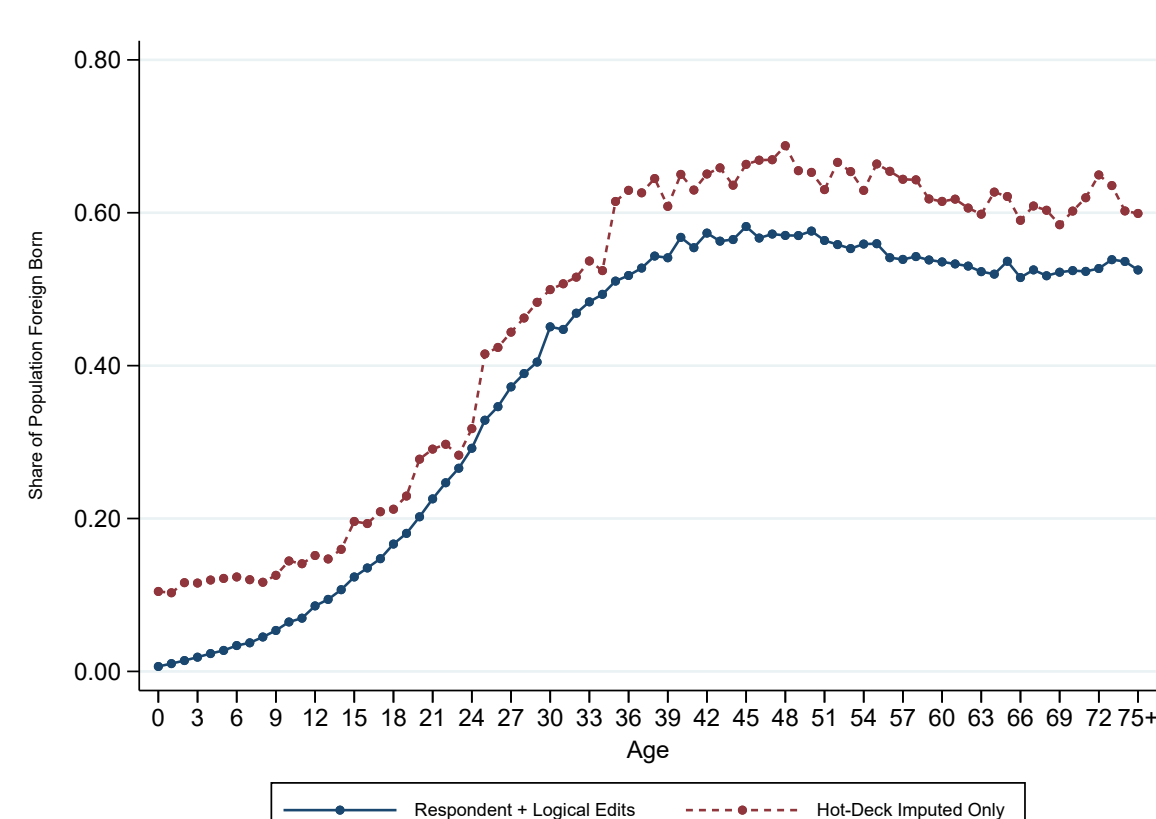
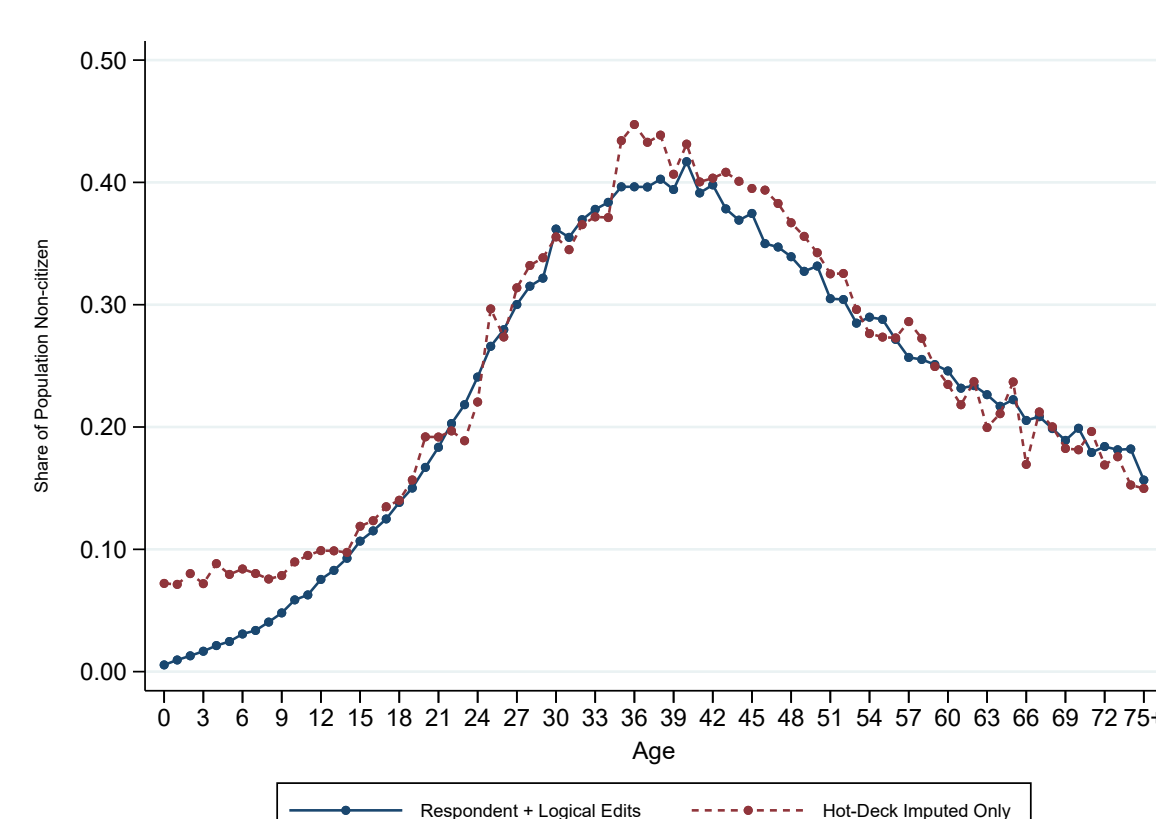


Figure 4. Non-citizen Hispanics



## Manski Bounds

The share of the US population that are foreign-born can be defined as:

$$P(F) = P(F|R=1) \cdot P(R=1) + P(F|R=0) \cdot P(R=0) \quad (1)$$

where

F = 1 (F = 0): the population unit is foreign-born (native-born)

R = 1 (R = 0): if a population unit did (did not) report citizenship status

- Empirical evidence identifies  $P(R)$  and  $P(F|R=1)$
- No empirical information on  $P(F|R=0)$
- Without assuming the exact distribution of foreign-born status among non-respondents,  $0 \leq P(F|R=0) \leq 1$

This yields the following sharp bounds:

$$P(F|R=1) \cdot P(R=1) < P(F) < P(F|R=1) \cdot P(R=1) + P(R=0) \quad (2)$$

- To estimate the lower bound: suppose F = 0 for each sample member with missing data in the citizenship question
- To estimate the upper bound: suppose F = 1
- Generates two extreme imputations of each case of missing data
- The point estimate of the share of the foreign-born when using the Census imputations lies between the upper and lower bounds
- Bounds provide maximum degree of uncertainty from item nonresponse
- Estimates within Manski bounds are valid estimates

## Interval Estimates of the US Immigrant Population

Figure 5. Foreign-Born

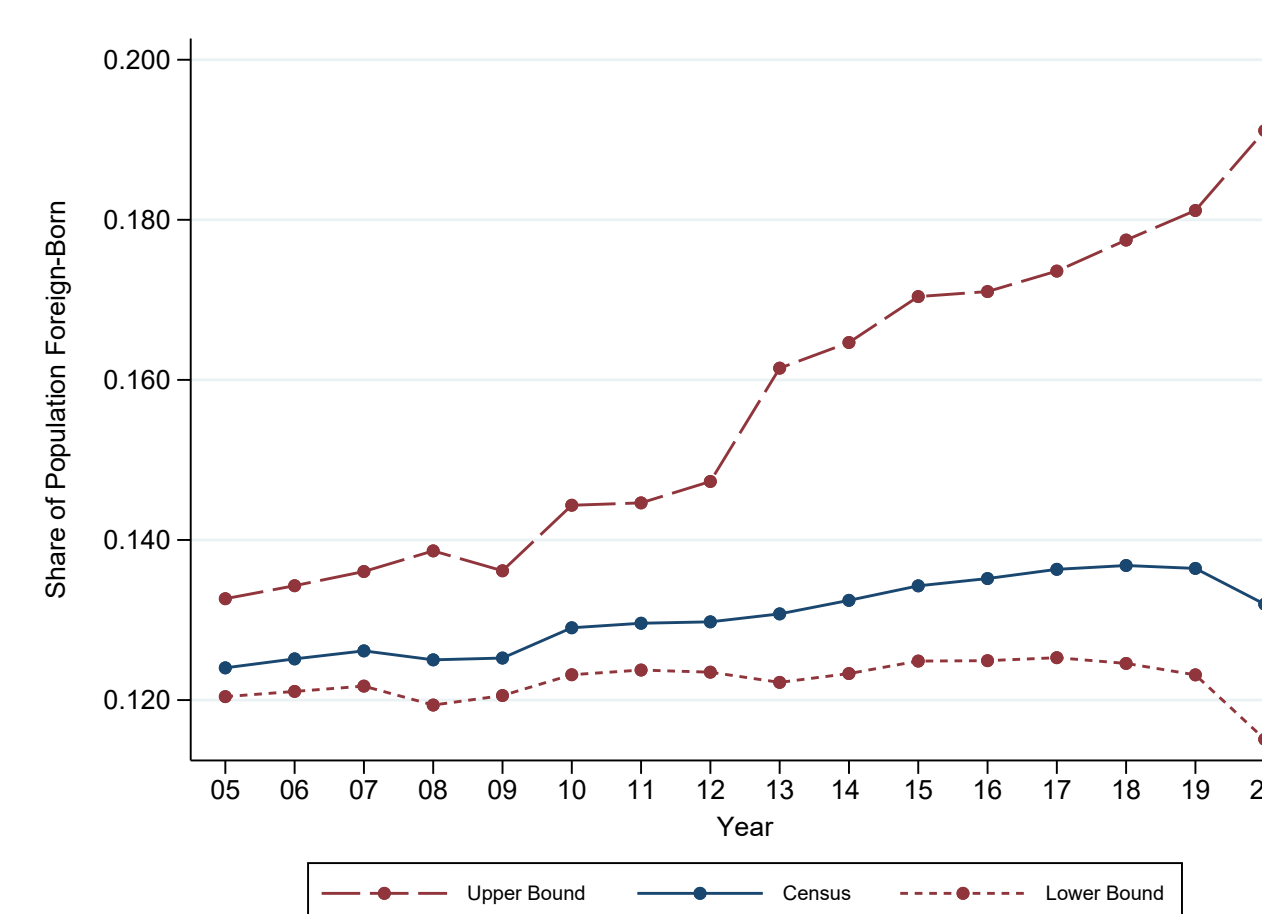
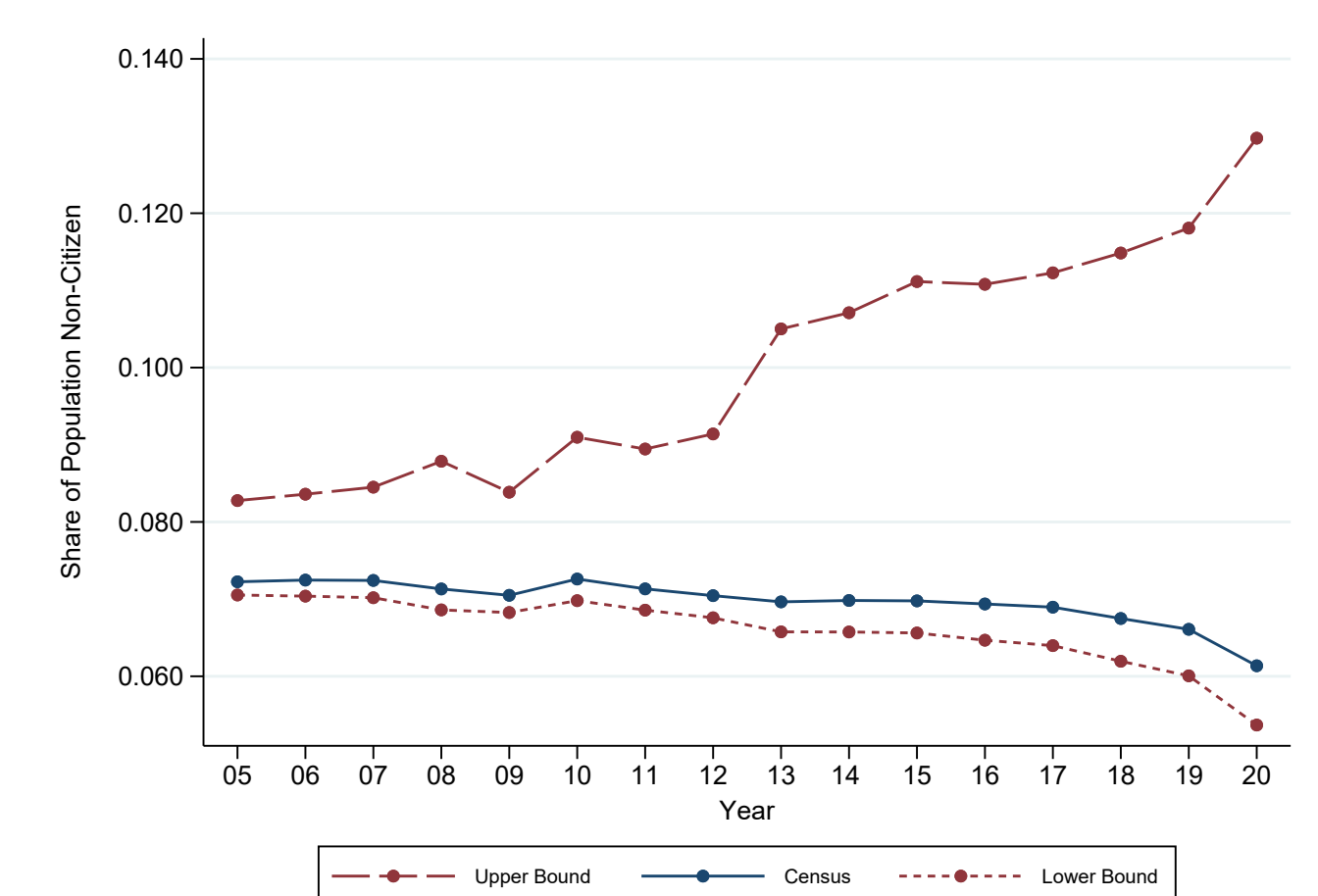


Figure 6. Non-Citizen



### Size of Foreign-Born Population (2019)

- Bounds: 40.4 and 59.4 Million
- vs. 44.8M point estimate

### Size of Non-citizen Population (2019)

- Bounds: 19.7 and 38.7 Million
- vs. 21.7M point estimate

## Interval Estimates of the US Undocumented Population

### Manski Bounds for Residual Residual Method

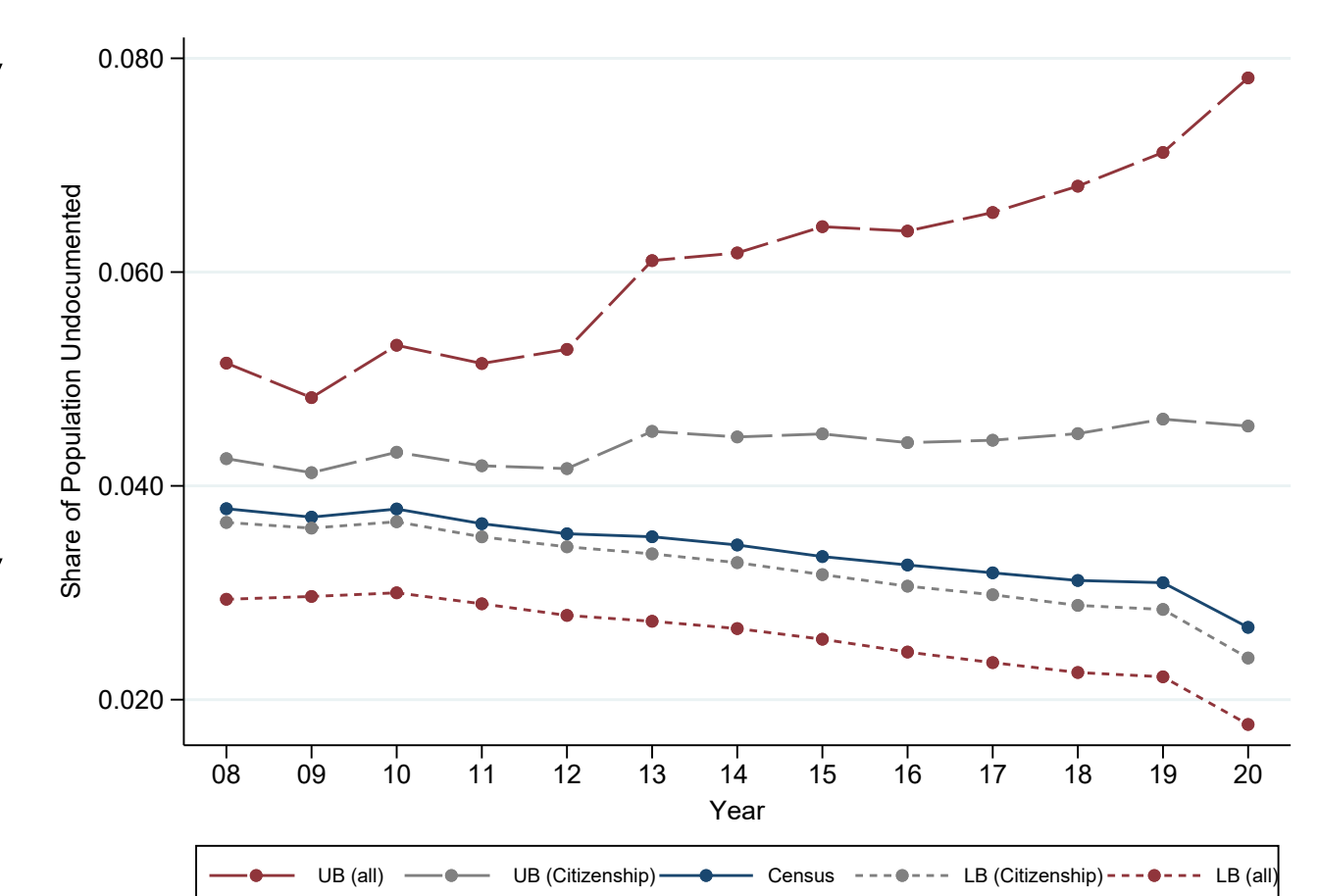
#### Lower Bound:

- All imputed values are assigned so that they satisfy the conditions
- Non-respondents assigned as native born
- Residual method is then performed

#### Upper Bound:

- All imputed values are assigned so that they fail to satisfy the conditions
- Non-respondents assigned as Non-citizens
- Residual method is then performed

Figure 7. All Questions in Residual Method



### Size of Undocumented Population (2019)

- Bounds: 7.3 and 23.3 Million (vs. 10.15M point estimate)

## Conclusion

- Assumptions on the distribution of legal status among non-respondents have to be made to create point estimates
- MAR assumption typically used is a strong assumption in the context of legal status and assumes away all nonrandom error from nonresponse.
- Considerable uncertainty when taking into account nonsampling error
- Without strong assumptions, we can say little about the size and legal composition of the US Foreign-Born population using survey data alone.