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# Linking Survey and Administrative Data to Measure Income, Inequality, and Mobility

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Medalia, Carla; Meyer, Bruce D.; O'Hara, Amy; and Wu, Derek, "Linking Survey and Administrative Data to Measure Income, Inequality, and Mobility" (2018). *2018 ADRF Network Research Conference Presentations*. 40.  
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**DOI** <https://doi.org/10.23889/ijpds.v3i5.1058>

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# Linking Survey and Administrative Data to Measure Income, Inequality, and Mobility

## **Abstract**

Income is one of the most important measures of well-being, but it is notoriously difficult to measure accurately. Income data are available from surveys, tax records, and government programs, but each of these sources has important strengths and major limitations when used alone. We are linking multiple data sources to develop the Comprehensive Income Dataset (CID), a restricted micro-level dataset that combines the demographic detail of survey data with the accuracy of administrative measures. By incorporating information on nearly all taxable income, tax credits, and cash and in-kind government transfers, the CID surpasses previous efforts to provide an accurate and comprehensive measure of income for the population of U.S. individuals, families, and households. We use models to evaluate differences across the data sources and explore imputation methods and trends over time. The CID can enhance Census Bureau surveys and statistics through investigating measurement error, improving imputation methods, and augmenting surveys with the best possible estimates of income. It can also be used to improve the administration of taxes by the Internal Revenue Service and forecast and simulate changes in programs and taxes. Finally, the CID has substantial advantages over other sources to analyze numerous research topics, including poverty, inequality, mobility, and the distributional consequences of government transfers and taxes.

## **Comments**

**DOI** <https://doi.org/10.23889/ijpds.v3i5.1058>

# Linking survey and administrative data to measure income, inequality, and mobility

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ADRF Network Research Conference

November 13, 2018

Joint with:

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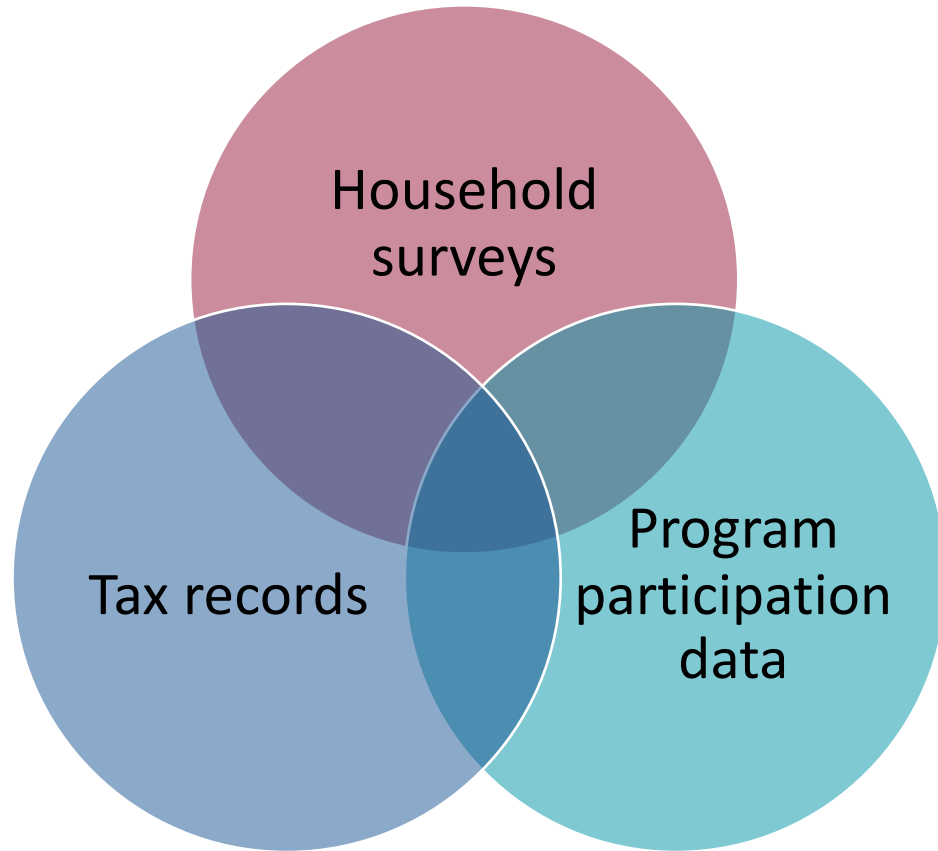
*Disclaimer:* Any opinions and conclusions expressed herein are those of the author(s) and do not necessarily represent the views of the U.S. Census Bureau. All results have been reviewed to ensure that no confidential information is disclosed.

# Motivation



- Income is extremely important as both outcome and predictor
- Income is difficult to measure: sources have strengths and weaknesses
- Previous research has combined sources, but scope and generalizability are limited

# A Comprehensive Income Dataset (CID)



- Accurate and comprehensive measure of income for individuals, families and households
- Income, demographic characteristics, government programs and tax credits
- Uses: survey improvement, policy evaluation, and research

# Income is difficult to measure

Source	Strengths	Weaknesses
Household surveys	Rich demographics, representative of population, flexible platform	Measurement error, under-reporting, non-response <sup>1</sup>
Tax records	Accuracy, broad coverage (with information returns)	Lacks demographics, program information for in-kind benefits, and information on non-taxable income Tax units not necessarily economic unit Under-reporting
Program participation data	Accuracy, needed to evaluate programs, eligibility and other information not available on surveys	Limited history and demographics Misses non-recipients

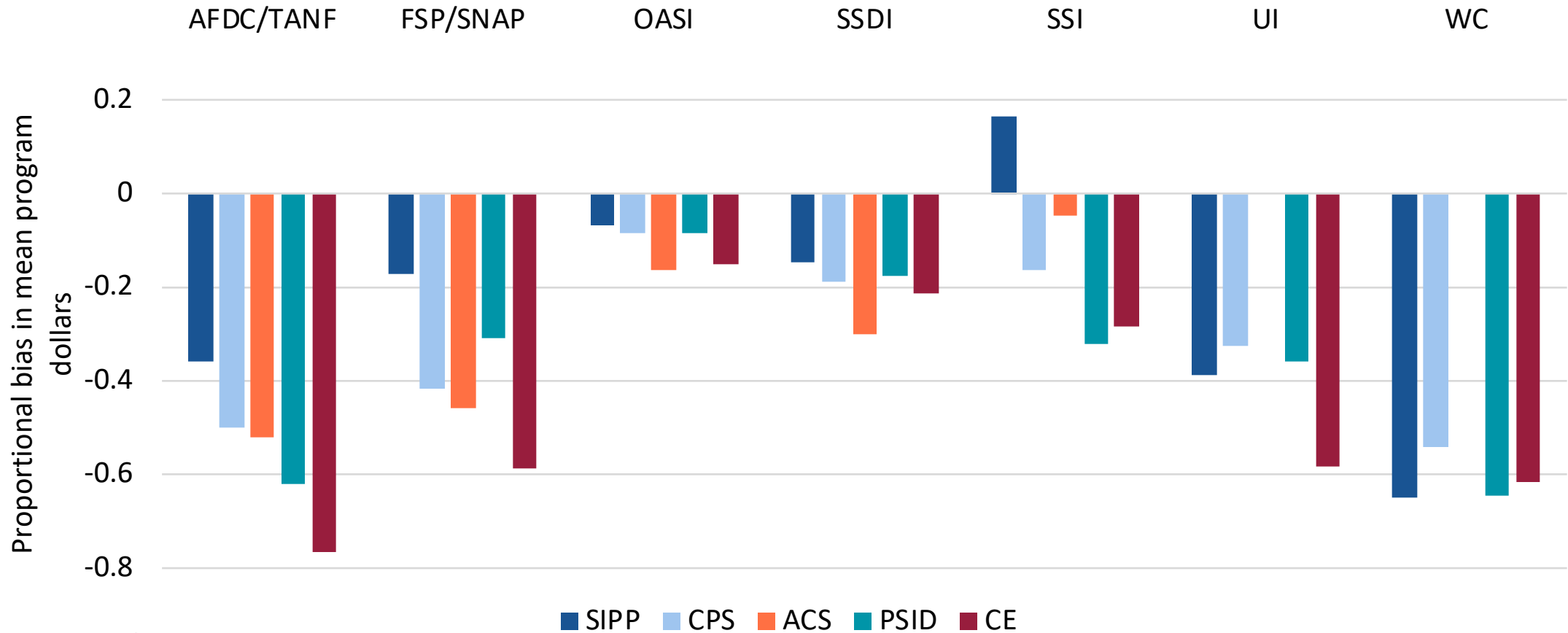
<sup>1</sup>Bee and Mitchell 2017; Meyer, Mok, and Sullivan 2015; U.S. Census Bureau 1993

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# Surveys underestimate income from government programs





# Income is difficult to measure

Source	Strengths	Weaknesses
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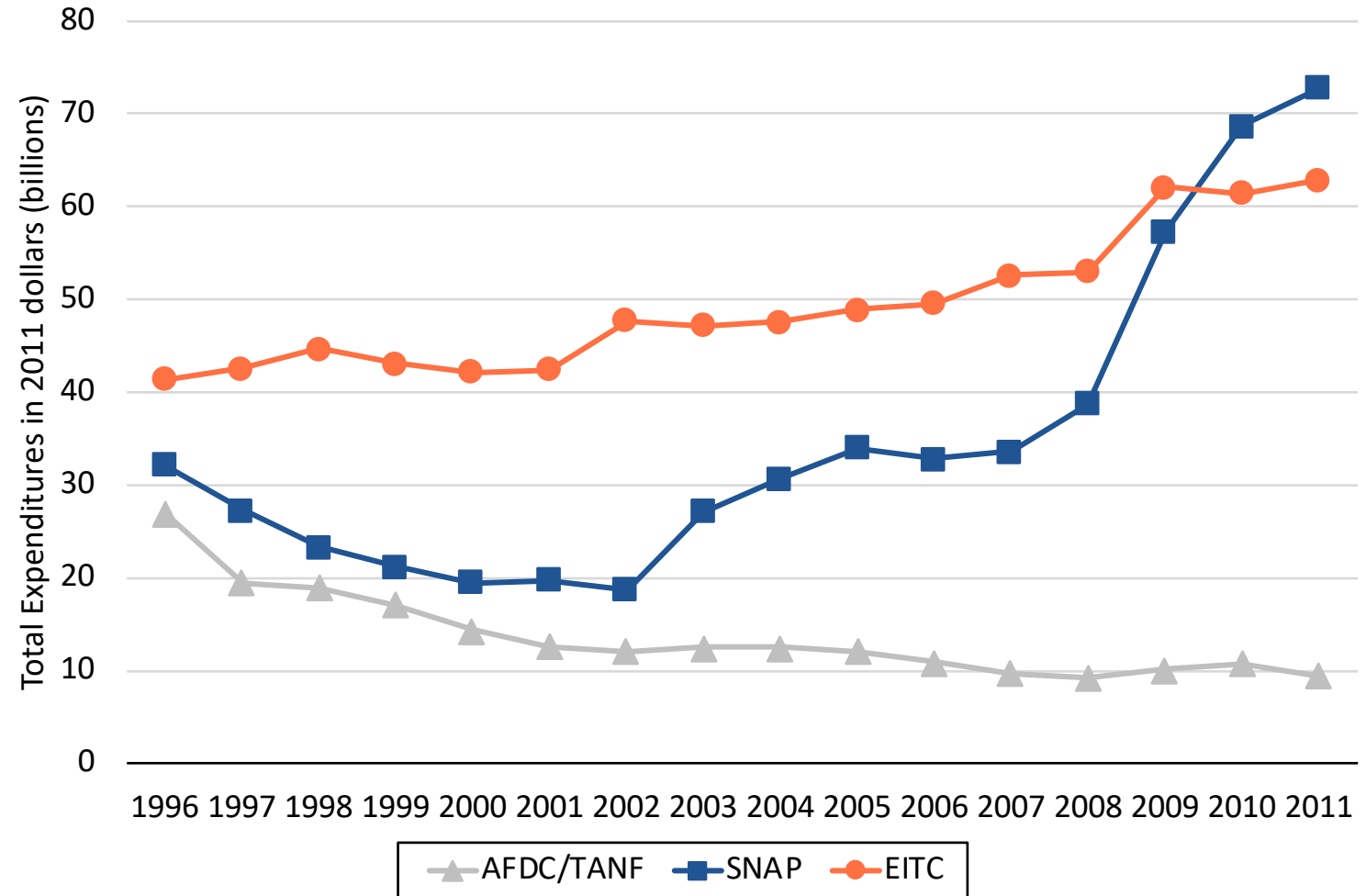
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# Defining income

- Focus on material well-being
- Includes income from all sources, some non-cash benefits
- State and federal income and payroll taxes

## Trends in Benefits for Selected Transfers, 1996-2011



# Data for CID

Source type	Phase I	Phase II
Household surveys	Current Population Survey (CPS) Survey of Income and Program Participation (SIPP) American Community Survey (ACS)	Consumer Expenditure (CE) Survey
Tax data	Forms 1040, W-2, 1099-R	More detailed 1040 extracts, more extensive info returns Tax credits (e.g. EITC) Unemployment Insurance (UI)
Federal programs	SSA: Social Security and Supplemental Security Income HUD: Federal housing assistance HHS: Medicare and Medicaid enrollment, TANF	VA: Veterans Benefits
State programs	Public Assistance (e.g. TANF) SNAP, WIC LIHEAP	More Public Assistance, SNAP, WIC, LIHEAP Workers Compensation

# Methods

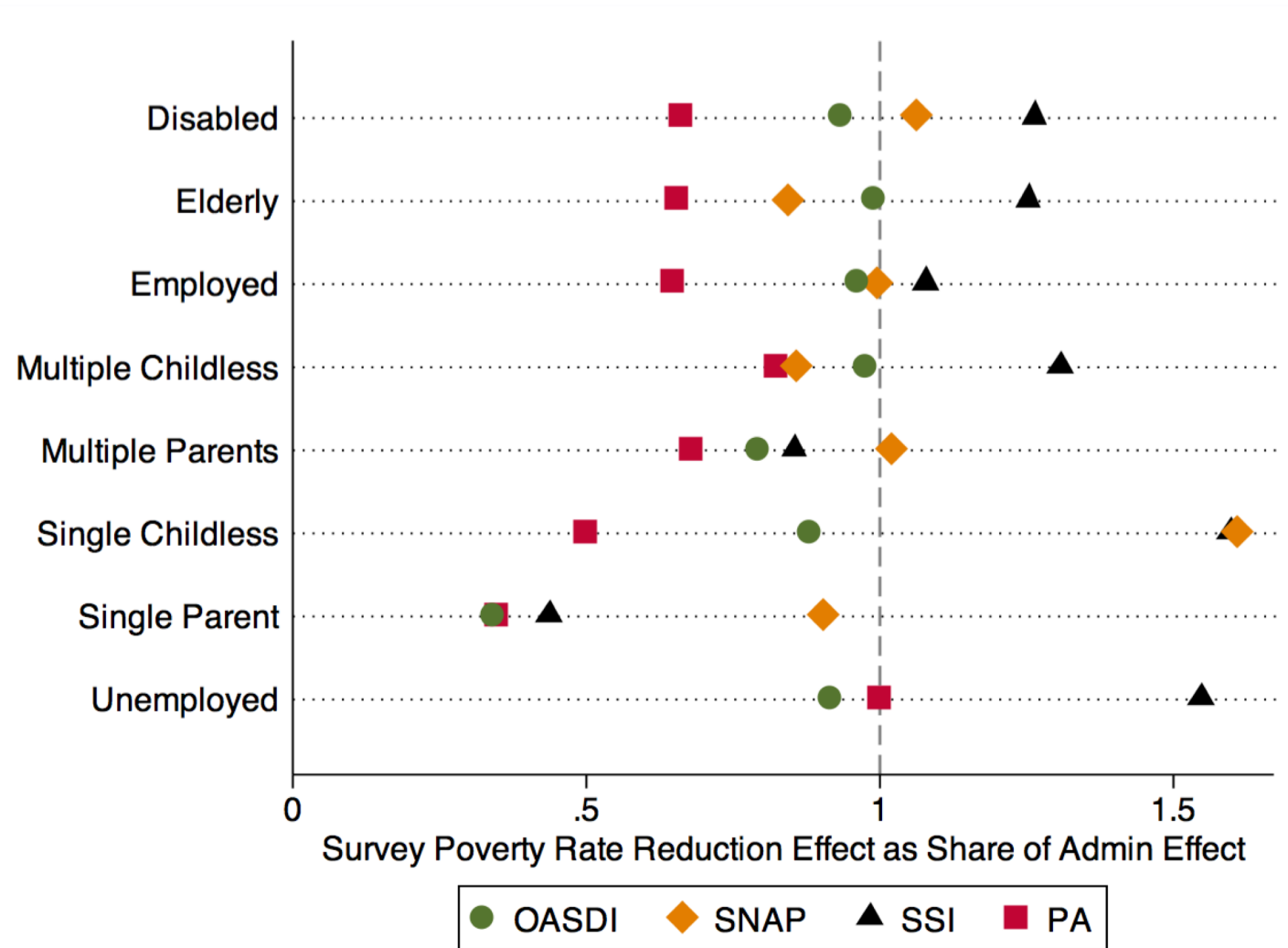
- Records linked using Protected Identification Keys (PIKs)
  - Linkage rate: 99% of most admin records, 90-97% of survey data
  - Adjust sample weights to account for inability to link
- Unit of analysis reconciliation: tax unit, household rosters
- Link all dollars from admin records to survey households
- Assumptions regarding which income source is more accurate

# Progress on CID

- Developing a prototype
- Interagency agreements
- Linking data and cleaning data
- Assessing quality of linkages, characteristics and accuracy of data
- Gathering documentation and metadata
- Three years of funding
- Initial projects

# Estimated poverty rate reduction using administrative and survey data

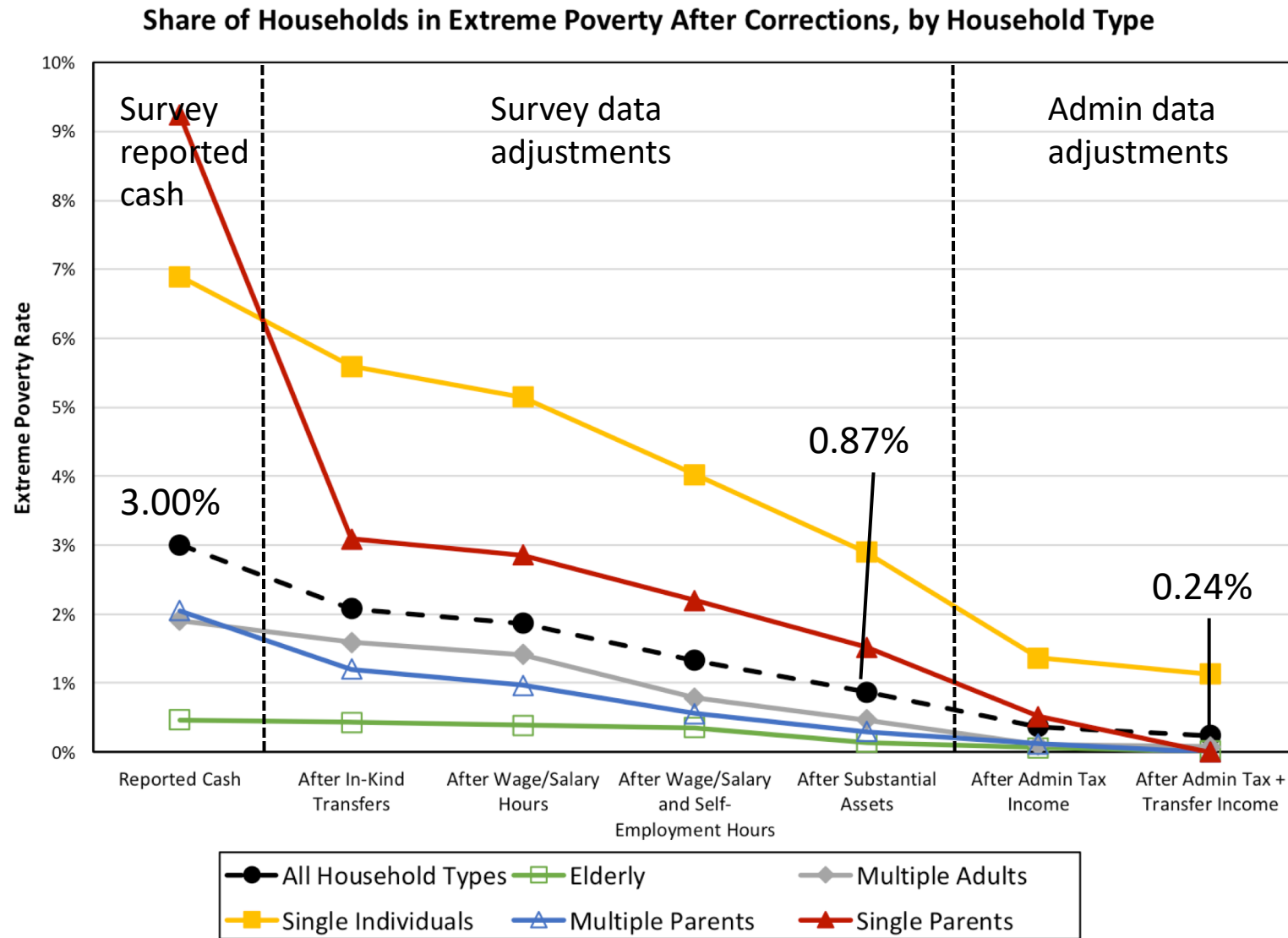
The poverty reduction of Social Security and means-tested transfers (Meyer and Wu 2018)



Source for survey data: 2008 SIPP Panel, Waves 1-14

# Percent of households in extreme poverty – under \$2/person/day

The use and misuse of income data and the rarity of extreme poverty in the United States (Meyer, Mooers, Wu, and Medalia 2018)



Source for survey data: 2008 SIPP Panel, Wave 9



# Future direction

## Now

- Acquire new data; provide get-backs to agencies
- Better documentation of data and methods
- Gather feedback from potential users

## Vision and challenges

- Make available in FSRDCs
- Develop path to get from prototype to production
- Challenges to implement CID in survey production environment
  - Mismatch of reference periods
  - Availability of data – not all states
  - Timeliness of data releases

# Thank you!

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