# Matching individuals in the Current Population Survey

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#### Outline



2 Matching respondents in the Current Population Survey

- Literature on CPS matching
- Our matching algorithm
- Creating longitudinal weights

#### 3 Further work

### Outline



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  - Literature on CPS matching
  - Our matching algorithm
  - Creating longitudinal weights

#### 3 Further work

Motivation

#### The Economic Security Index

- $ESI = \sum w_i L_i / \sum w_i$
- where  $L_{it} = \left(\frac{y_{it} M_{it} D_{it}}{e_{it}} < \left(\frac{3}{4}\right) \frac{y_{it-1} M_{it-1} D_{it-1}}{e_{it-1}}\right) (W_{it} < W_{it}^*) (1 R_{it})$
- A comprehensive measure of economic risk based on the realized losses of household resources.
- Accounts for:
  - Income (adjusted for family size)
  - Out of pocket medical expenses
  - Liquid financial resources (wealth and debt)

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### Data limitations and use of multiple surveys

#### • No survey captures all of these

- Closest thing we had at the beginning was the SIPP which provided:
  - Short mini-panels
  - Income
  - Medical expenditure data\*
  - Wealth/debt data
- Medical expenditure data in the SIPP was not continuous so we used a model based imputation
- For more information on construction of the index, see (Hacker et al., 2011)

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Matching respondents in the Current Population Survey Further work Motivation

#### Transition to the CPS

- Big attrition in the SIPP
- Break between 2004 and 2008 panels coincided with the Great Recession
- SIPP waves and years did not line up

Pros:

- Attrition is at least relatively consistent in the CPS
- Reference period in the March Supplement is the preceding calendar year
- Available for (nearly) every year and extending earlier than the 1980's
- CPS designed to produce geographic estimates

Cons:

- No medical spending or wealth data
- Only two year panels

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Matching respondents in the Current Population Survey Further work Motivation

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Literature on CPS matching Our matching algorithm Creating longitudinal weights

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Matching respondents in the Current Population Survey
 Literature on CPS matching

- Our matching algorithm
- Creating longitudinal weights

#### 3 Further work

< 17 ▶

Literature on CPS matching Our matching algorithm Creating longitudinal weights

#### Census Bureau guidance

Years: Variables:	1968-1971 Random Cluster Code (F6-10) and Serial Number (F11-14)
Years:	1971-1972 Changes in CPS clustering procedures and the accompanying change of household identification numbers prevent matching 1971 and 1972 March CPS files.
Years:	1972-1973 The 1972 file uses 1960 random cluster codes while the 1973 file uses 1970 random cluster codes, thus precluding the matching of records.
Years: Variables:	1973-1975 Random Cluster Code (F7-11). Segment Number (F12-16), and Serial Number (F217-218)
Years: Variables:	1975-1976 1975: Random Cluster Code (F7-11) Segment Number (F12-16), and Serial Number (F217-218) 1976: Random Cluster Code (H35-39), Segment Number (H40-43), and Serial Number (H44-45)
Years:	1976-1977 Matching is not possible because variables required for matching are in a different format each year.
Years: Variable:	1977-1985 Household Identification Number (H18-29)
Years:	1985-1986 Matching is not possible because the 1986 file is based entirely on the 1980 census design sample.
Years: Variable:	1986-1993 Household Identification Number (H18-29)
Years:	1994-1995 (See CPS, March 1995 User Note 1.)
Years:	1995-1996 Matching is not possible because the March 1996 file is based entirely on the 1990 Census design sample.
Years:	1996-2010 Variable: Household Identification Number (H344-358)

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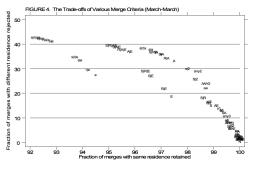
#### Need for a matching algorithm

- Household identifiers are helpful, but the survey is one of geographic residences (no effort to follow respondents)
- Especially in early years, there was little effort to keep flag changes in occupants
- There is a migration flag, but that too is error prone
- Introduction of non-rotation group individuals in the March Supplement starting in early 2000's

### Madrian and Lefgren

- Often cited widely used as the "model"
- Generates potential matches based on identifiers verifies using characteristics
- Code hosted at NBER
- Only provides guidance on a limited set of years (1980-1998)
- Hightlights tradeoff between matches and mismatches

Craig et al.



#### Others

- Welch (1993)\*\*\*—emphasized importance of selecting match criteria based on parameters to be measured
  - You would not want to use relationship to household head as a validating variable if changes in family structure are the object of interest
- Feng (2001) and (2008) Probabilistic matching and observation that household IDs did not uniquely identify households

Matching respondents in the Current Population Survey Further work Creating longitudinal weights

#### Outline



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#### 3 Further work

< 17 ▶

 Introduction
 Literature on CPS matching

 Matching respondents in the Current Population Survey
 Our matching algorithm

 Further work
 Creating longitudinal weights

#### Goals

- Maximize potential matches
- Minimize any bias created by the matching process
- As continuous a series as possible (minimize missing years)
- Handle the differing demands of changes to the CPS

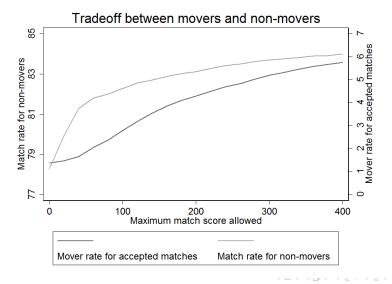
## The algorithm

- **1** Create all pairwise combinations within household IDs
- Generate a match score based on weighted set of characteristics (increasing with difference)
- Second the second se
- Match individuals who minimize each other's distances (both directions)
- Stipulate a minimum which at least one person in the household must meet (0 or 10)
- Small number of ties (usually <10) are dropped as duplicates in one year or new residents

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#### Setting the maximum match score



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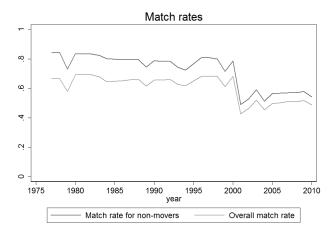
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#### Advantages to this approach

- Because we do not require that line numbers match exactly, we can match individuals even in years for which line numbers are absent.
- Use of distance matching provides an elegant solution to the problem of non-uniue household IDs
- Any bias introduced by this method is at least applied to the entire series
- This method produces consistent match and mis-match rates.

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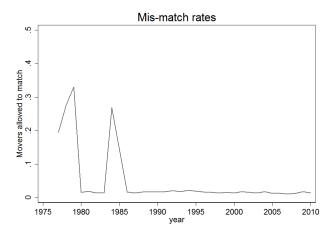
#### Analyzing the performance



Note: Decline in match rates in early 2000's are a result of SCHIP and "rotation group 9" oversample (See Feng, 2008).

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#### Analyzing the performance pt. 2



Note: Mover flags in late 70's refer to migration since 1975 and 1985 flag refers to migration since 1980.

Matching respondents in the Current Population Survey Further work Creating longitudinal weights

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Literature on CPS matching Our matching algorithm Creating longitudinal weights

#### Longitudinal weights

- As per Nichols (2007), we reweight the matched group to the full year-2 sample using propensity scores
- Not usually discussed in the volatility literature Hertz 2007 reweights, but only to adjust for dropping imputations
- Two stage process
  - Generate probabilities of match based on
  - adjust resulting weights to match the proportions of full sample by age, race, and sex

#### Further work and Wrap up

- I hope to create a flexible set of programs to allow users to adopt this approach of creating matches in ways that are sensitive to their needs
- Match Outgoing Rotation Groups of the monthly CPS for more timely and frequent estimates

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