

#### Changes to the Imputation Routine for Health Insurance in the CPS ASEC

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# Acknowledgements

- Co-Authors
  - Joanna Turner, SHADAC
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Annual Social and Economic Supplement to the Current Population Survey (CPS ASEC)

- CPS is a monthly labor survey
- ASEC fielded in Feb-April
- Questions on work, income, migration and health insurance
- State representative (n~200,000)



# Health Insurance in CPS ASEC

- Measures coverage in previous calendar year
- Detailed information for each person
- Widely used...
  - Surveillance
  - Projecting costs of proposed legislation
  - Evaluating impact of enacted policy
  - Historically used to allocate federal funds to states for public health insurance programs



# Quality Improvement to Health Insurance

- Census Bureau dedicated to improving the quality of health insurance data
  - Conceptual definitions (1998)
  - Verification Question (2000)
  - Sample Expansion (2002)
  - Addition of premium costs and medical out-ofpocket information (2010)
  - Improvements to missing data imputation (2011)



# Background of ASEC Imputation

- Approximately 10% of monthly CPS sample does not respond to ASEC
  - All data for these cases are imputed
  - 'Full Supplement Imputations' (FSI)
- Additionally, 2-3% of responders are missing data on health insurance items



- Hot deck randomly draws values for missing cases (recipients) from similar, non-missing records (donors)
- Donors are organized into matrices consisting of variables that define "similar"
  - E.g. Age, marriage, work
- Assumes missing is random within cells

   Maintains correlations within complete data



# **Background of Imputation Problems**

- Davern et al., (2007) discovered errors in the hot deck specification...
  - Instrument allows any household member to be a private plan dependent
    - Interviews can press a single key to apply coverage to entire household
  - Allocation routine assigned dependent coverage only to nuclear family members of a policy holder
  - Did not consider other coverage the case may have had



# Methods in Davern et al., (2007)

- Compared Non-Elderly coverage rates by FSI
  - Hierarchical coverage variable
    - Any public, only private, uninsured
  - Multinomial logit
    - Controlled for variables in the hot deck
    - Relative Rate Ratios (RRR)
  - Alternative estimates
    - Removed FSI and re-weighted
    - Model based prediction



# Effect of Imputation Problem (2004 Data)

|   | Independent Variables                                 | RRR  | Standard Error |
|---|---|------|----------------|
| ſ | Full supplement imputation                            | 2.20 | 0.10***        |
|   | Full supplement imputation $\times$ one person family | 0.67 | 0.06***        |
|   | Full supplement imputation $\times$ under 19 years    | 1.05 | 0.07           |

| Estimate Type                     | Private Insurance<br>Rate (%) | Public Insurance<br>Rate (%) | Uninsured<br>Rate (%) |
|-----------------------------------|-------------------------------|------------------------------|-----------------------|
| Total population                  |                               |                              |                       |
| Unadjusted CPS                    | 68.1                          | 14.3                         | 17.6                  |
| Reweighted CPS                    | 69.1                          | 14.3                         | 16.6                  |
| Model based CPS (if none imputed) | 69.0                          | 14.3                         | 16.7                  |



Source: Table 3 from Davern et al. (2007) HSR: Health services Research 42:5 (October 2007)

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### Response by the Census Bureau

- Switch order
  - Public coverage imputed first, followed by private coverage
- Include public coverage in the private coverage matrix
- Remove nuclear family restriction
- Data from the new routine will be published in fall of 2011



# **Directly Purchased Coverage**

- Census discovered and corrected a coding error that undercounted directly purchased coverage for children
- This data reflects that correction
  - All estimates reflect the imputation change and the coding fix





- Document the effect of the new routine to health insurance estimates from the full file
- Determine if the new routine attenuates problem in full supplement imputation cases identified in previous work



#### Data

- 2009 CPS ASEC Research File
- 2009 SHADAC Enhanced CPS (ECPS)<sup>1</sup>
   FSI cases removed and data re-weighted
   Developed by SHADAC

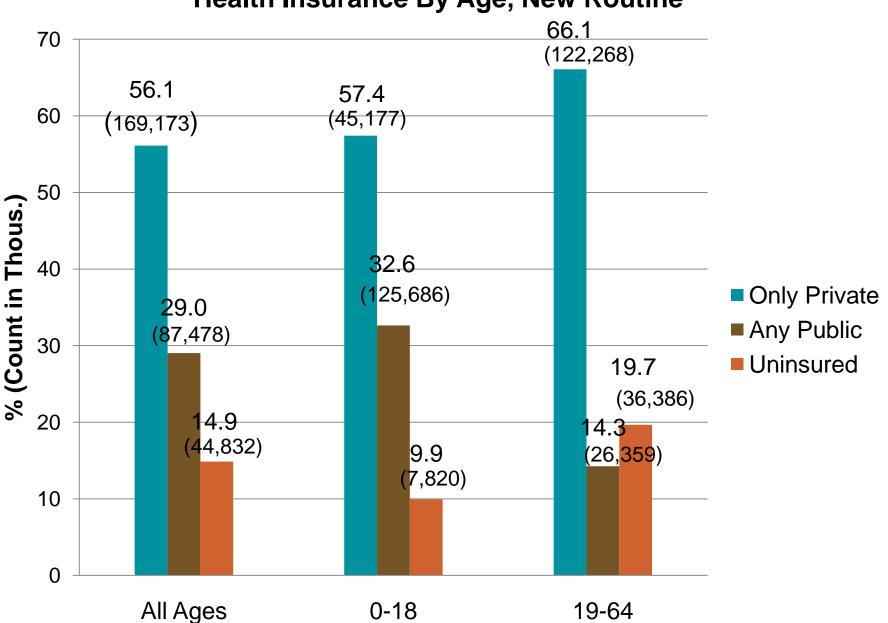
1. See Ziegenfuss, J. and Davern, M. "Twenty Years of Coverage: An Enhanced Current Population Survey: 1989–2008" Health Services Research 46:1, Part I (February 2011)

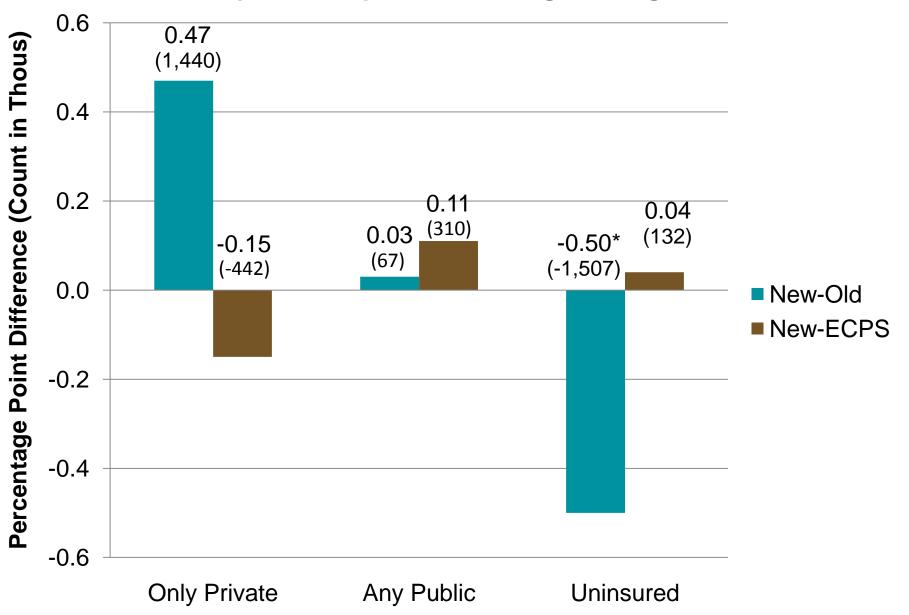


#### Methods

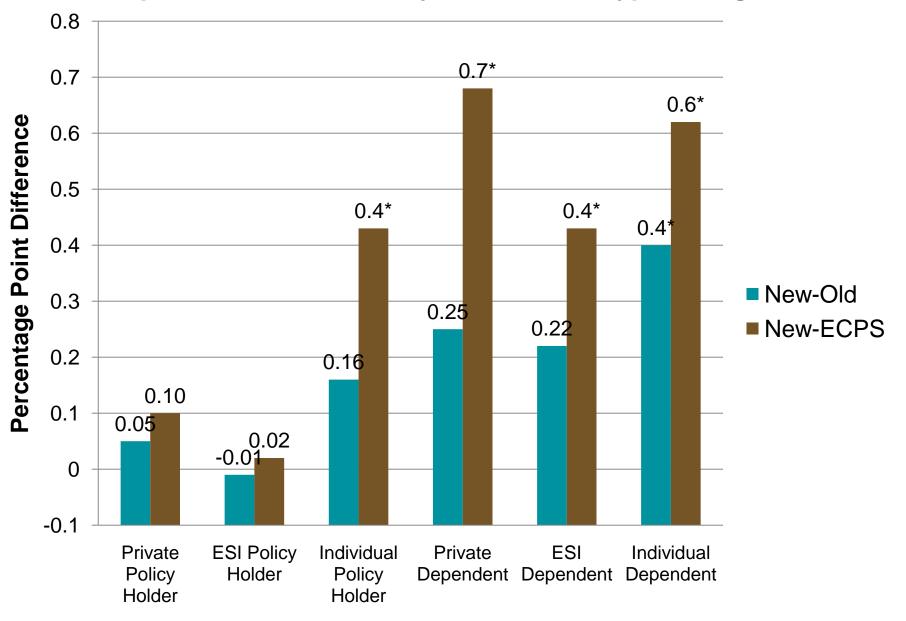
- Replicate Davern's study
- Bivariate comparisons
  - Hierarchical Coverage rates
    - Only private (private alone)
    - Any public (public alone or public and private)
    - Uninsured (no coverage in previous year)
  - Old Routine vs. New Routine vs. E-CPS
- Multinomial logistic regression to study impact of imputation change in FSI sample







#### Impact of Imputation Change, All Ages



#### Impact of New Routine by Private Plan Type, All ages

# Model

$$p_{ijr} = \frac{\exp(FSI_i\beta_{jr} + x_i\lambda_{jr})}{\sum_{l=1}^{3}\exp(FSI_i\beta_{lr} + x_i\lambda_{lr})}, j = 1,...3$$

- Person *i with coverage* j under routine r
- FSI: Full supplement status
- x: Covariates include hot deck variables and other important variables
- All Ages and no interactions
- Attenuation in new routine would indicate improvement



# Selected Means by Supplement Status

|                           | Not FSI |      | FS    | 61   |
|---------------------------|---------|------|-------|------|
|                           | %       | SE   | %     | SE   |
| Only Private <sup>1</sup> | 56.4    | .20  | 52.7* | .63  |
| Any Public <sup>1</sup>   | 29.0    | .16  | 29.0  | .54  |
| Uninsured <sup>1</sup>    | 14.5    | .14  | 18.3* | .46  |
| <18 yrs                   | 25.1    | 0.05 | 21.5* | 0.36 |
| < HS grad                 | 14.7    | 0.11 | 16.2* | 0.38 |
| Unemployed                | 4.8     | 0.06 | 4*    | 0.19 |
| White only                | 80.2    | 0.07 | 76.9* | 0.60 |

1. From the new routine

\* Significantly different at the p < 0.001 level



### **Selected Model Results**

|             | Uninsured v. Private |      | Public v. Private |      |
|-------------|----------------------|------|-------------------|------|
|             | RRR                  | SE   | RRR               | SE   |
| Old Routine |                      |      |                   |      |
| FSI         | 1.83*                | .077 | 1.40*             | .057 |
| New Routine |                      |      |                   |      |
| FSI         | 1.24*                | .059 | 1.23*             | .051 |

The adjusted Wald test of FSI was significant in both equations.

\* significant at p < 0.001 level.

Complete model controlled for gender, health, race/ethnicity, nativity, employment, poverty, family type, family size, education, veteran status, firm size, and self-employment.



# Key Findings

- The new routine increases insurance coverage by 1.5 million people relative to the old routine
- Gain occurs mainly for dependent coverage
- In line with expectations Davern et al and ECPS



# Key Findings

- Regression analyses showed that the undercount of private coverage in FSI cases attenuated
- While less substantial, FSI still significant
   Missing other logical inputs (state & poverty)
  - Limited by sample size



### Conclusions

- The imputation change appears to improve the quality of the ASEC health insurance data
- While a nuclear family restriction is conceptually appealing, the imputation routine is not the appropriate place to fix the problem



### Thank You!

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