# Decomposition of Error Introduced by *Ex- Post* Harmonization

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Christopher Ward, University of Michigan Felicia LeClere, University of Michigan Pamela Smock, University of Michigan Lynette Hoelter, University of Michigan Peter Granda, University of Michigan James Lepkowski, University of Michigan

### Introduction

- Integrated Fertility Survey Series at ICPSR
- Differences over time have consequences for survey quality
- Harmonizing imperfectly comparable variables over time produces error
  - 1. Impact on variable selection
  - 2. Impact on harmonized variable specification
  - 3. Analytical concerns



## Situating Harmonization in Total Survey Error

• Proposed model for harmonization error (adaptation of Biemer & Lyberg, 2003):

$$-MSE_{\mathbf{H}} = (B_{SPEC} + B_{NR} + B_{FR} + B_{MEAS} + B_{DP} + B_{\mathbf{H}})^{2} + Var_{SAMP} + Var_{MEAS} + Var_{DP} + Var_{\mathbf{H}}$$

#### where:

- MSE<sub>H</sub> = harmonization error-adjusted MSE
- $B_H$  = harmonization bias
- Var<sub>H</sub> = harmonization variance



## **Expansion of Harmonization Error**

- Harmonization Bias:
  - $B_H = B_{H\_SPEC} + B_{H\_MEAS} + B_{H\_DP}$
- Harmonization Variance:
  - $Var_H = Var_{H\_SAMP} + Var_{H\_MEAS} + Var_{H\_DP}$
- Harmonization introduces specification, measurement, data processing, and sampling error
  - Impact on quality of data
- How to estimate?
  - Example: specification bias



# Specified Harmonized Construct: Number of R's Children in Household

Child Type	1955	1988	1995	2002: NCHILDHH	2002: NUMKDHH
Biological	X	X	X	X	X
Adopted			X	X	X
Step				X	X
Partner's				X	X
Legal ward				X	X
Foster				X	X
Nephew/ niece					X
Grandchild					X



### Which Variable to Harmonize?

NCHILDHH or NUMKDHH?

- Two factors to consider:
  - Minimize the introduction of error
  - Substantive comparability over time
- What we need to know:
  - Which variable overestimates the number of biological or adopted children in the household by a greater margin?
  - Problem: It is difficult to estimate the number of over-counted children



### Framework Application

- Five different combinations of types of relationships between the respondent and children in the household
- Let  $E_1$ ,  $E_2$ ,  $E_3$ ,  $E_4$ , and  $E_5$  denote:
- $E_1 = \{biological\}$
- $E_2 = \{biological, adopted\}$
- $E_3$  = {biological, adopted, stepchild, partner's, legal ward, foster child}
- E<sub>4</sub> ={biological, adopted, stepchild, partner's, legal ward, foster child, nephew/niece, grandchild}
- $E_5 = \{ \text{all child relationship types} \}$
- We observe:



#### Extent of Error

• To estimate the number of miscounted children:

#### where:

 $E_n$  is the event of all outcomes (child types) in a given study variable  $E_h$  is the event of all outcomes (child types) in the harmonized construct

- The total bias depends on the extent to which the children in the sample *do not* belong to *both* events  $E_n$  and  $E_h$
- Solution: select NCHILDHH to minimize number of miscounted children in 2002



## Specifying the Harmonized Construct

- The number of possible ways to specify the harmonized variable depends on the underlying variables
- Four ways of specifying the harmonized variable (assuming selection of NCHILDHH in 2002):
  - 1) Number of biological children (E<sub>1</sub>)
  - 2) Number of biological or adopted children (E<sub>2</sub>)
  - 3) Number of biological, adopted, step, partner's, legal ward, or foster children (E<sub>3</sub>)
  - -4) Number of all children (E<sub>5</sub>)



## Consequences for Quality

- The dilemma: how to specify a harmonized variable that both minimizes error and has substantive value to users?
  - Our solution: specify the harmonized variable as "all children"
- The specification bias depends on the extent to which the children in the sample *do not* belong to *both* events E<sub>5</sub> and E<sub>1</sub>



# Guidelines for Specifying Harmonized Constructs

- Specification bias is unknown but can be estimated
  - Use external data to estimate probabilities

- Specification of harmonized variable depends primarily on two factors:
  - Extent of expected specification bias in a given specification of the harmonized variable
  - Substantive considerations



## Summary

- Harmonization error must be considered when harmonizing data *ex-post*
- Example: specification bias influences variable selection, guides specification of the harmonized construct
  - Goal to improve quality of data
- Analytical consequences?
- Generalization of specification bias estimation?



### Supplementary Examples

• Highest Grade Attended vs. Highest Grade Completed

• Specifying "Religiously-affiliated" vs. "Church-related" in religious school attendance

- R is Hispanic/Latino
  - Recoded origin vs. direct question

