

# Design and Analysis of Sample Surveys

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Class 3b: Survey nonresponse

# Adjusting for nonresponse

- ▶ Item nonresponse
  - ▶ Complete-case analysis
  - ▶ Available-case analysis
  - ▶ Deterministic imputation
  - ▶ Multiple (random) imputations
  - ▶ Modeling (writing down the likelihood of the observed data)
- ▶ Unit nonresponse
  - ▶ Poststratification
  - ▶ Weighting
  - ▶ Multilevel regression and poststratification (MRP)

# Understanding missingness and corrections in any particular example

- ▶ Studying the missingness process:
  - ▶ Compare missing to observed items
  - ▶ Compare missing to observed people
  - ▶ Logistic regression to model  $\Pr(\text{missing})$
- ▶ Understanding and checking imputations
  - ▶ Inspecting the distributions of imputed variables
  - ▶ Building trust via cross-validation
  - ▶ Canary variables

# Summary of adjustments for *item* nonresponse

- ▶ Existing missing-data imputation packages in R and Stata
- ▶ Can sort-of check using cross-validation or simply by inspecting the distribution of imputed values
- ▶ Carry along 10 completed datasets, analyze each separately, incorporate between-imputation variance only at the final step of the analysis
- ▶ Complete-case and available-case analysis can be convenient, sometimes using partial imputation to fill in the holes

# Summary of adjustments for *unit* nonresponse

- ▶ Correcting for known differences between sample and population
- ▶ Weighted estimates of population averages and totals
- ▶ Regression controlling for all variables that predict inclusion in the sample (“inclusion” = sampling & response)
- ▶ *Multilevel* regression to adjust for a large number of predictors
- ▶ *Poststratification* to sum up to larger groups in the population
- ▶ Many practical and statistical challenges

# Nonresponse in different survey modes

- ▶ Consider the sampling frame for each mode:
  - ▶ Mail
  - ▶ Face-to-face
  - ▶ Telephone
  - ▶ Internet