# Analyzing Missing Data

#### Introduction

Problems

**Using Scripts** 

## Missing data and data analysis

- Missing data is a problem in multivariate data because a case will be excluded from the analysis if it is missing data for any variable included in the analysis.
- If our sample is large, we may be able to allow cases to be excluded.
- If our sample is small, we will try to use a substitution method so that we can retain enough cases to have sufficient power to detect effects.
- In either case, we need to make certain that we understand the potential impact that missing data may have on our analysis.

## Tools for evaluating missing data

- SPSS has a specific package for evaluating missing data, but it is included under the UT license.
- In place of this package, we will first examine missing data using SPSS statistics and procedures.
- After studying the standard SPSS procedures that we can use to examine missing data, we will use an SPSS script that will produce the output needed for missing data analysis without requiring us to issue all of the SPSS commands individually.

# Key issues in missing data analysis

We will focus on three key issues for evaluating missing data:

- The number of cases missing per variable
- The number of variables missing per case
- The pattern of correlations among variables created to represent missing and valid data.
- Further analysis may be required depending on the problems identified in these analyses.

# Problem 1

- 1. Based on a missing data analysis for the variables "employment status," "number of hours worked in the past week," "self employment," "governmental employment," and "occupational prestige score" in the dataset GSS2000.sav, is the following statement true, false, or an incorrect application of a statistic?
- The variables "number of hours worked in the past week" and "employment status" are missing data for more than half of the cases in the data set and should be examined carefully before deciding how to handle missing data.
  - 1. True

- 2. True with caution
- 3. False
- 4. Incorrect application of a statistic

#### Identifying the number of cases in the data set



## Request frequency distributions





## Number of missing cases for each variable



# Problem 2

- 2. Based on a missing data analysis for the variables "employment status," "number of hours worked in the past week," "self employment," "governmental employment," and "occupational prestige score" in the dataset GSS2000.sav, is the following statement true, false, or an incorrect application of a statistic?
- 14 cases are missing data for more than half of the variables in the analysis and should be examined carefully before deciding how to handle missing data.
  - 1. True

- 2. True with caution
- 3. False
- 4. Incorrect application of a statistic

#### Create a variable that counts missing data









## Complete specifications for new variable

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## A frequency distribution for *nmiss*

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## The frequency distribution



### Answering the problem



# Problem 3

- 3. Based on a missing data analysis for the variables "employment status," "number of hours worked in the past week," "self employment," "governmental employment," and "occupational prestige score" in the dataset GSS2000.sav, is the following statement true, false, or an incorrect application of a statistic? Use 0.01 as the level of significance.
- After excluding cases with missing data for more than half of the variables from the analysis if necessary, the presence of statistically significant correlations in the matrix of dichotomous missing/valid variables suggests that the missing data pattern may not be random.
  - 1. True

- 2. True with caution
- 3. False
- 4. Incorrect application of a statistic

# Compute valid/missing dichotomous variables

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#### Change the value for missing data

The dichotomous variable should be coded 1 if the variable has a valid value, 0 if the variable has a missing value.

**First**, mark the *System- or user-missing* option button.

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click on the Add button



#### Complete the value specifications

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#### Complete the recode specifications

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### The dichotomous variable

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#### Filtering cases with excessive missing variables



#### Enter specifications for selecting cases





#### Enter specifications for selecting cases





## Complete the specifications for selecting cases

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## Cases excluded from further analyses

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## Correlating the dichotomous variables

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### Specifications for correlations



#### The correlation matrix



38

Cannot be computed because at least one of the variables is constant.

#### The correlation matrix

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### The correlation matrix

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Cannot be computed because at least one of the variables is constant.

# Using scripts

- The process of evaluating missing data requires numerous SPSS procedures and outputs that are time consuming to produce.
- These procedures can be automated by creating an SPSS script. A script is a program that executes a sequence of SPSS commands.
- Thought writing scripts is not part of this course, we can take advantage of scripts that I use to reduce the burdensome tasks of evaluating missing data.

## Using a script for missing data

42

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- The script "MissingDataCheck.sbs" will produce all of the output we have used for evaluating missing data, as well as other outputs described in the textbook.
  - Navigate to the link "SPSS Scripts and Syntax" on the course web page.
  - Download the script file "MissingDataCheck.exe" to your computer and install it, following the directions on the web page.

#### Open the data set in SPSS

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Run Script				SE	PSS Processor is	ready	

#### Select the missing data script



## The script dialog

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Correlation matrix of	valid/missing dichotomous	variables		
T-tests and chi-squa	are tests for valid/missing Gr	roups		
Delete variables cre	ated by this analysis	Delete output fro	om previous SPSS commands	

## Complete the specifications

The checkboxes are marked to produce the output we need for our problems. The only additional option	Variables in the data set: ID ID X11 Specification Buying X12 Structure of Procurement X13 Type of Industry (SIC) X14 Type of Buying Situation	Metric variables:       X5 Service       X6 Salesforce Imag       X7 Product Quality       X9 Usage Level       X10 Satisfaction Letter       X8 Firm Size	ge evel	
s to compute the t-tests and chi-square tests for all of the variables.	nalyses: Tally number of missing cases for each variable Tally number of missing variables for each case Tally the pattern of missing data Correlation matrix of valid/missing dichotomous v T-tests and chi-square tests for valid/missing Gro	Rem Select analys the va on pa	the variables for the sis. This analysis uses ariables for the example ge 56 in the textbook.	
$\frac{1}{2}(x_j + x_{j+1})$	Delete variables created by this analysis     Cancel     Feedback:	Delete output from previous S	PSS commands Click on the OK button to produce	

48	The script finishes
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#### Output from the script

