## The Effectiveness of Matrix Sampling with Non-Cognitive Measures

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Matrix Sampling with Non-Cognitive Assessments

# Matrix sampling

- \* Useful when we are <u>not</u> interested in individual scores, but instead we are interested in group-level information.
  - \* AKA item-examinee sampling, type 12 sampling, incidence sampling
  - A technique where samples of items are administered to samples of subjects
  - \* Reduced testing demand on individual participants





#### What motivates our work

- The technique has powerful utility for assessing group level information
- Surprisingly few studies use the technique in noncognitive assessment, even when group level information is desired.
- \* Some authors have recommended more conceptually and practically simpler solutions to reduce testing burden, such as shortening scales (e.g., Fraser, 1982).

#### **Our Intent**

- To demonstrate the utility of matrix sampling specifically for group level non-cognitive assessment
  - \* And hopefully raise awareness of the technique
- To test the effectiveness of matrix sampling as compared to the shortening of scales (i.e., a 'simpler' method with the same goal)

## Methods

We used an existing dataset from a measure of non-cognitive traits.

The measure

- \* Three primary areas, with 4 subfactors each
  - \* Motivation, Perseverance, and Optimism
  - Primary factors were 24 items long
    - \* Secondary factors were 6 items long

**Participants** 

\* 281 students in grades 6 through 12.

## Our Design

- 1. Fixed reduction of the measure's length
  - \* I.e., shortening of the scale
- 2. Matrix sampling
  - \* I.e., sampling items and participants
- We proceeded via iterations, having an iteratively smaller test and sampling iteratively fewer items to each participant

# Analysis

- Each iteration was compared to the original group mean via T-test
- The T-tests produced 129 trials with a measure of success or failure
  - \* These 129 trials were then analyzed via  $\chi^2$

#### Results

Method A failed 44% of the 129 trials of mean equivalence, whereas Method B never failed to reproduce the initial group mean, even when only a single item was sampled randomly to varying participants.

\* 
$$\chi^2$$
 was significant (p<.001)

#### **Contingency Table**

Obtained			
	Pass	Fail	<u>Total</u>
Short	72	57	129
Matrix	129	0	129
Total	201	57	258

Expected			
	Pass	Fail	<u>Total</u>
Short	100.5	28.5	129
Matrix	100.5	28.5	129
Total	201	57	258

$\chi^2$	73.19	
df	1	

## Conclusions

- \* The result demonstrates both that
  - \* 1) Matrix sampling is an effective method for estimating group means on non-cognitive measures
  - \* 2) The matrix sampling technique leads to better estimates with fewer items than does simply reducing scale length.

## Implications

- More efficient group-level sampling for non-cognitive assessment
- Matrix sampling could have great uses in technology enhanced or fully online programs



# On-going research

- We are now running simulation studies with a colleague
  - One question of interest is how many participants are necessary to get good estimates, relative to scale size.
    I.e., what are the minimum numbers.
- We will be working with a researcher who will be utilizing the technique in the collection of an extensive dataset; they will be administering a noncognitive measure.

### **Questions or Comments?**

 Questions may also be addressed to Jesse.Pace@ku.edu

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