



# Response or Recall Bias?

## Choosing Between the True and Retrospective Pretest

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# Biases in Pretests



**Pretest**

**Posttest**

# Biases in Pretests

True



Response Shift Bias

1. **Reconceptualization:** definitions of the construct change over time
2. **Reprioritization:** the values assigned to the scale change over time
3. **Recalibration:** understanding of the response scale changes over time

# Biases in Pretests

Pretest



Posttest



Retrospective

Posttest

# Biases in Pretests

True



Retrospective



Response Shift Bias

1. **Reconceptualization:** definitions of the construct change over time
2. **Reprioritization:** the values assigned to the scale change over time
3. **Recalibration:** understanding of the subject matter changes over time



Recall/Recollection Bias

1. **Recall:** remembering former state as better or worse than it actually was
2. **Present State Effect:** using info on current state to reconstruct former
3. **Implicit ToC:** reconstructing memory based on current state & assumptions

# Biases in Pretests

Pretest



Posttest



Retrospective

Posttest

Pretest



Retrospective

Posttest

# Our Data

Pretest

n = 642

Retrospective

n = 548

Posttest

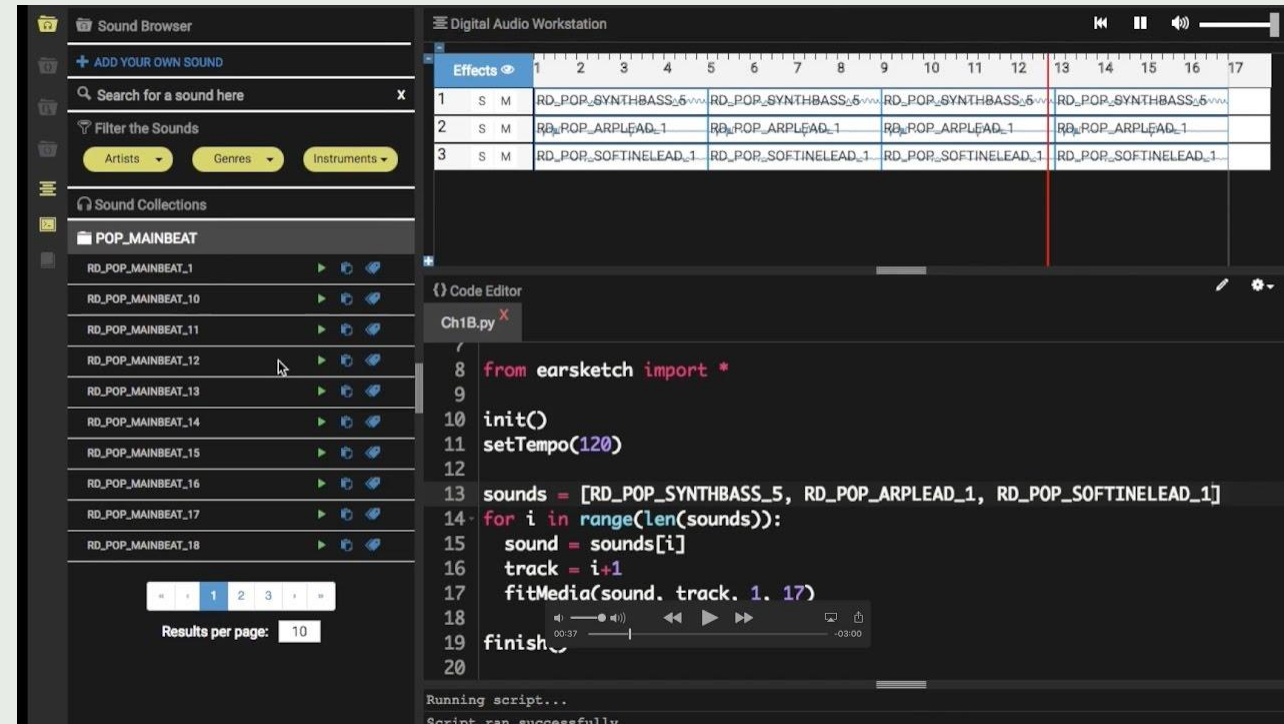
n = 504



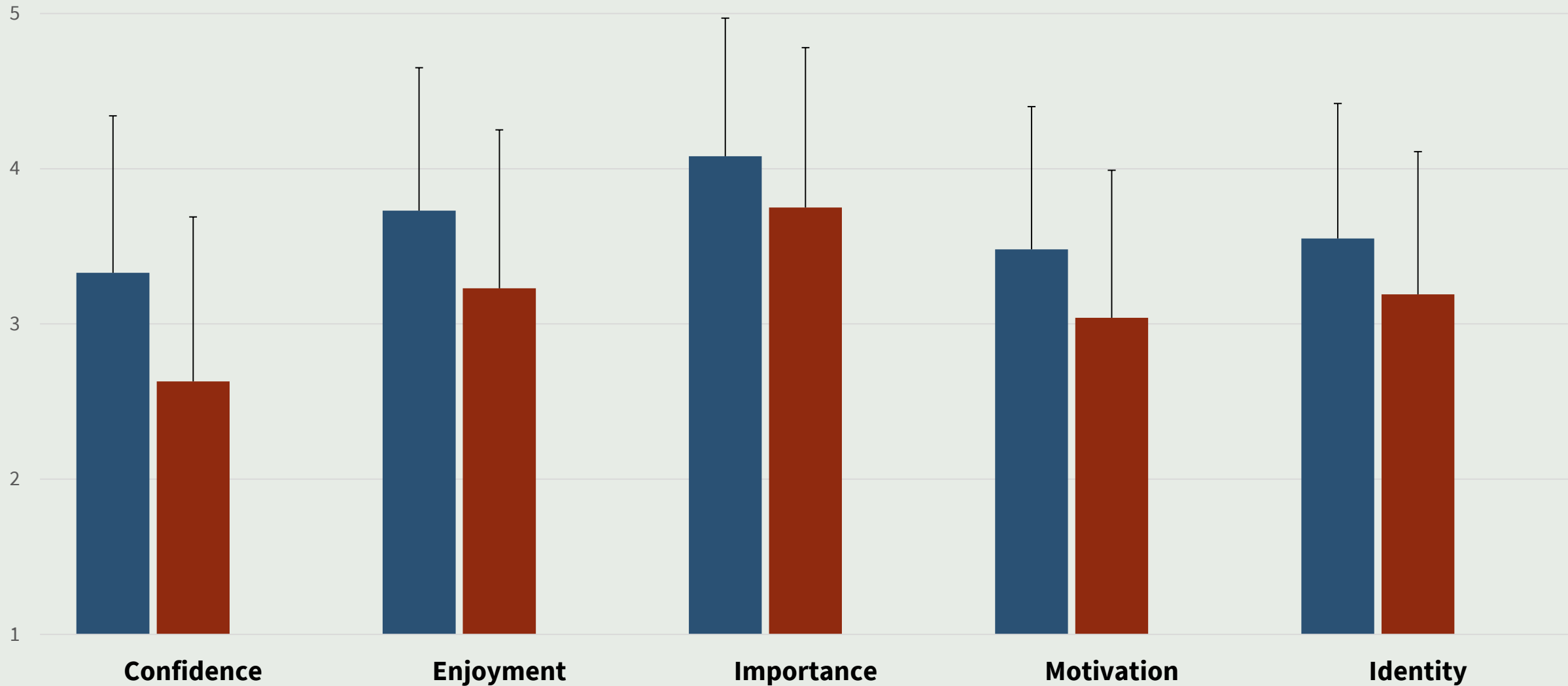
## Attitudes Towards Computing scale

(Wanzer, McKlin, Edwards, Freeman & Magerko, 2019)

1. Confidence  $\omega = .815$
2. Enjoyment  $\omega = .667$
3. Importance  $\omega = .807$
4. Motivation  $\omega = .822$
5. Identity  $\omega = .815$

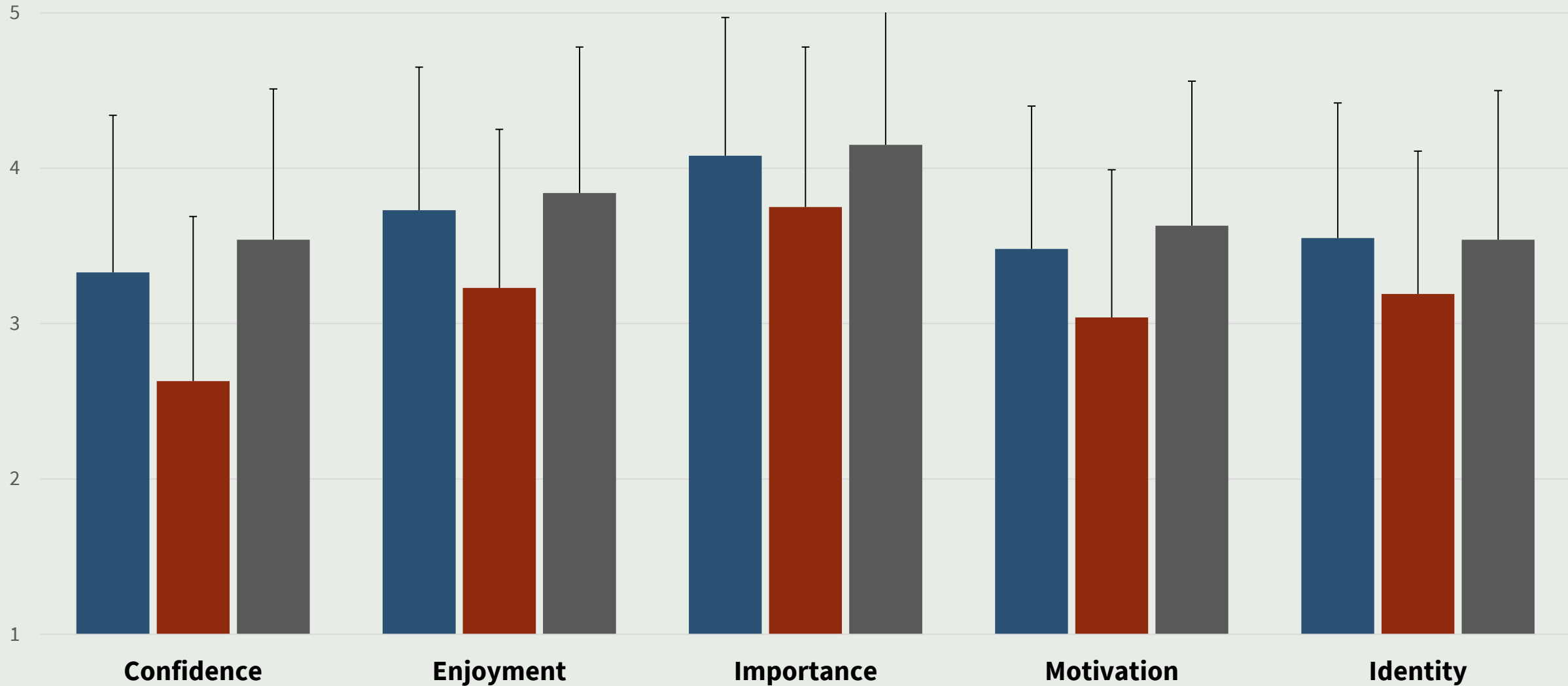


# Pretest and Retrospective Means

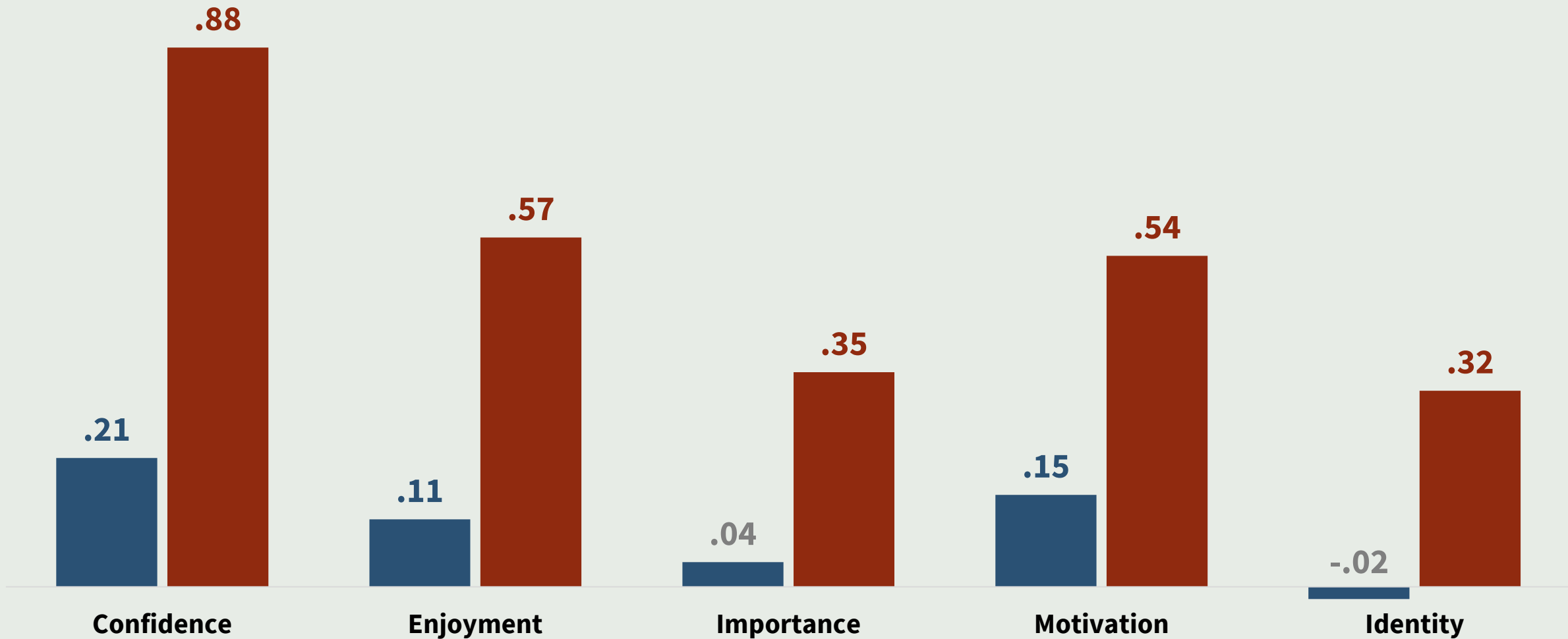




# Pretest, Retrospective, and Posttest Means



# Cohen's d effect sizes for **true** & **retrospective** pretests to posttest



# Pretests

True



Retrospective

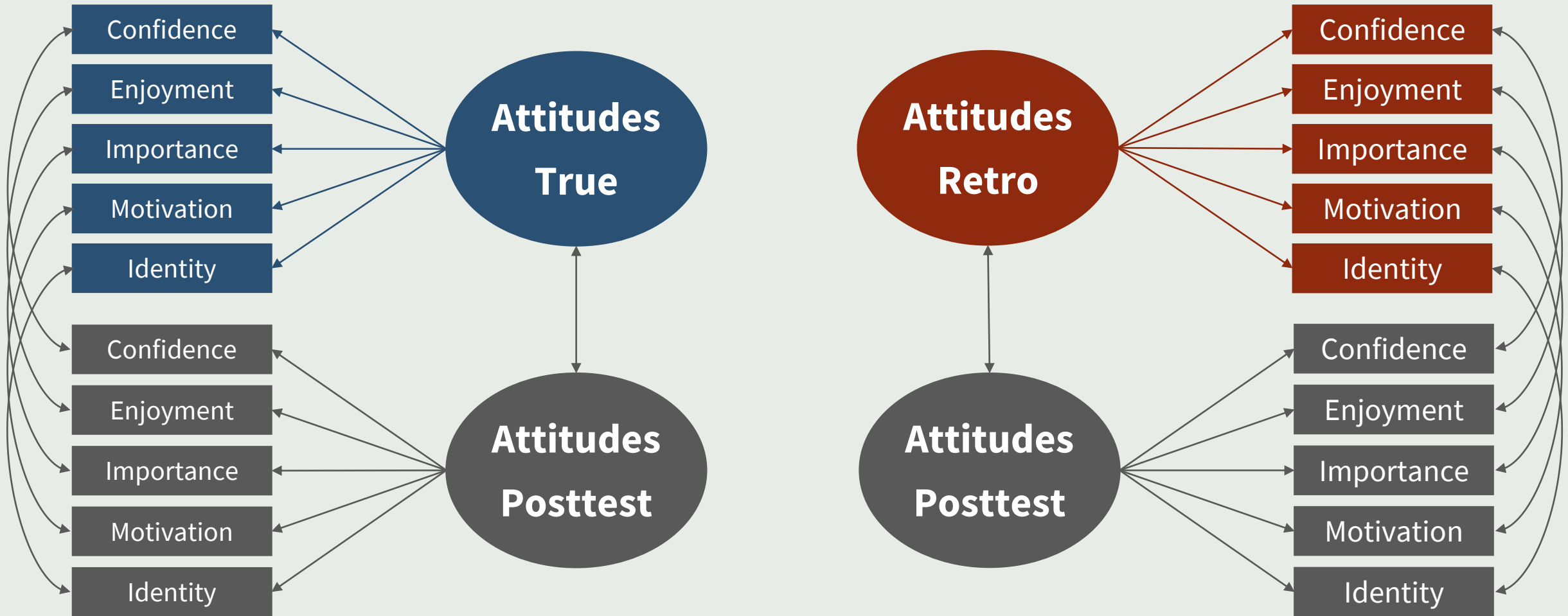


# Measurement Invariance

Determining whether the same underlying construct is being measured across groups or **across time**

Used within Confirmatory Factor Analysis (CFA) or Structural Equation Modeling (SEM)

# Measurement Invariance

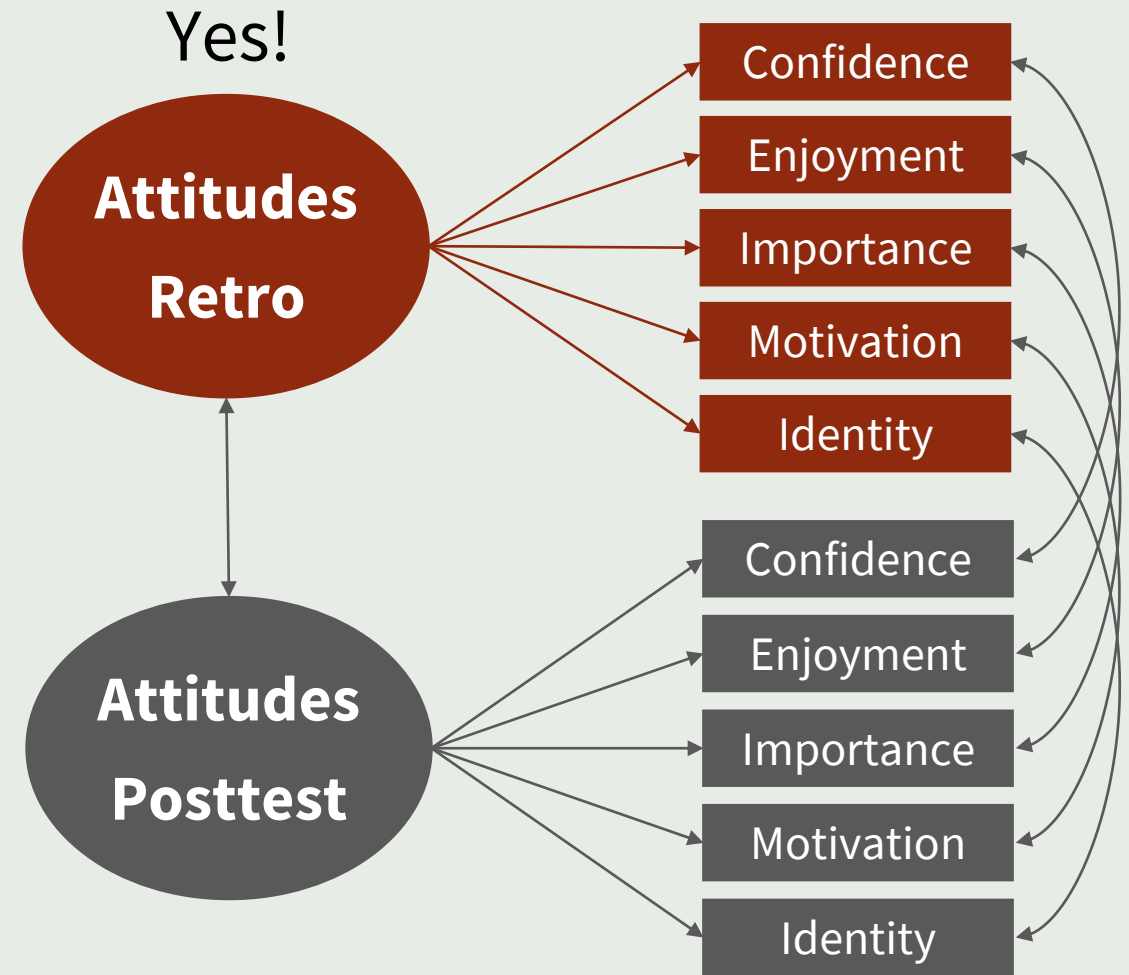
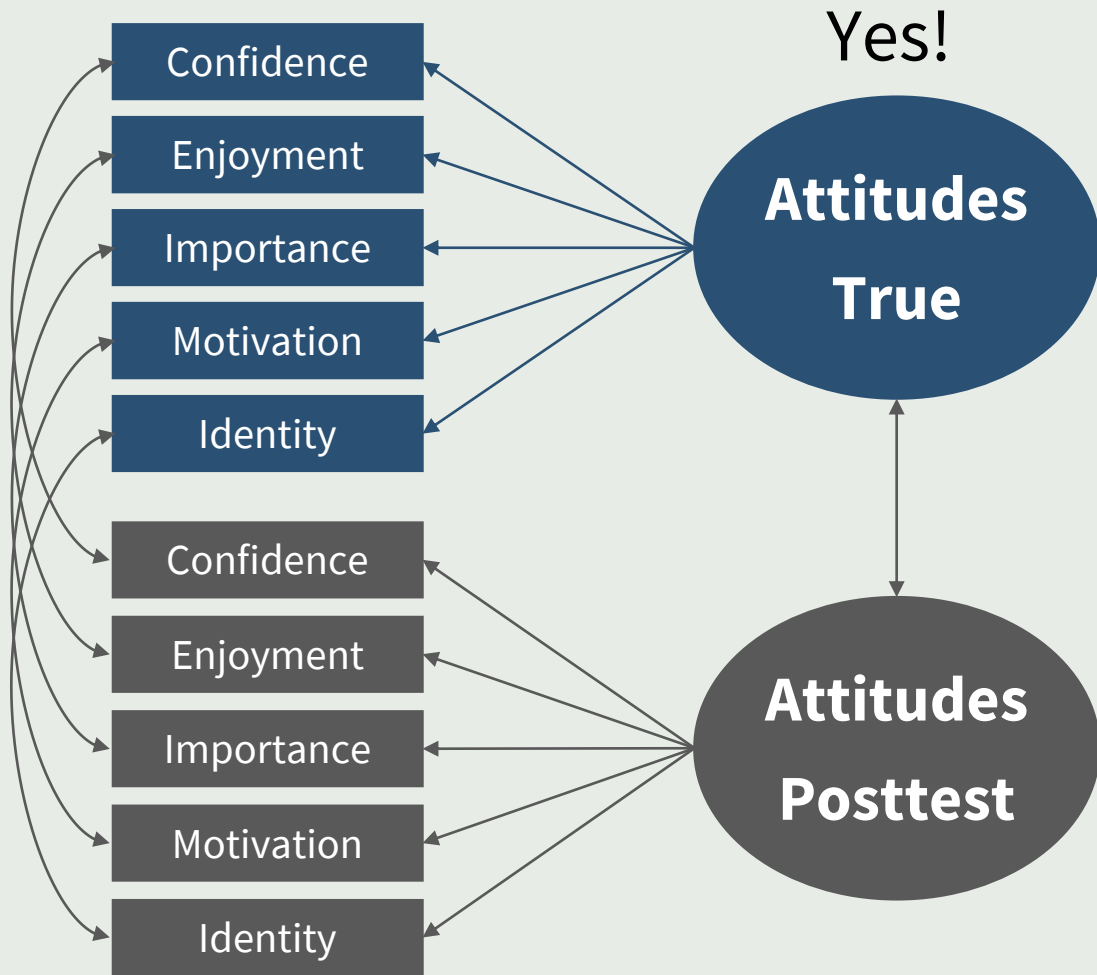


# Measurement Invariance

Invariance	What is constrained?	If variant, which response shift bias?
<b>Configural</b>	Nothing	Reconceptualization

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# Configural Invariance



$\chi^2 (29) = 74.59$ , CFI = .98, RMSEA = .06, SRMR = .03

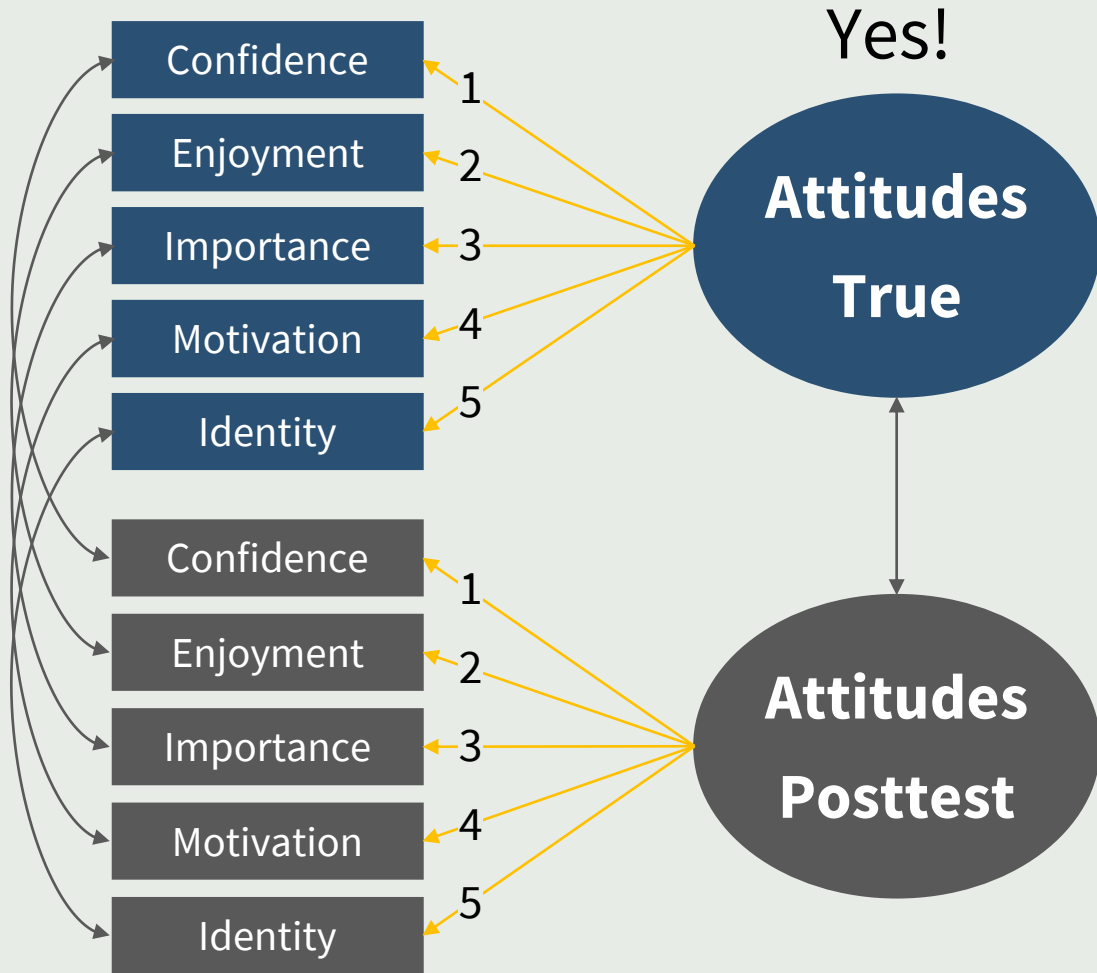
$\chi^2 (29) = 123.35$ , CFI = .98, RMSEA = .08, SRMR = .06

# Measurement Invariance

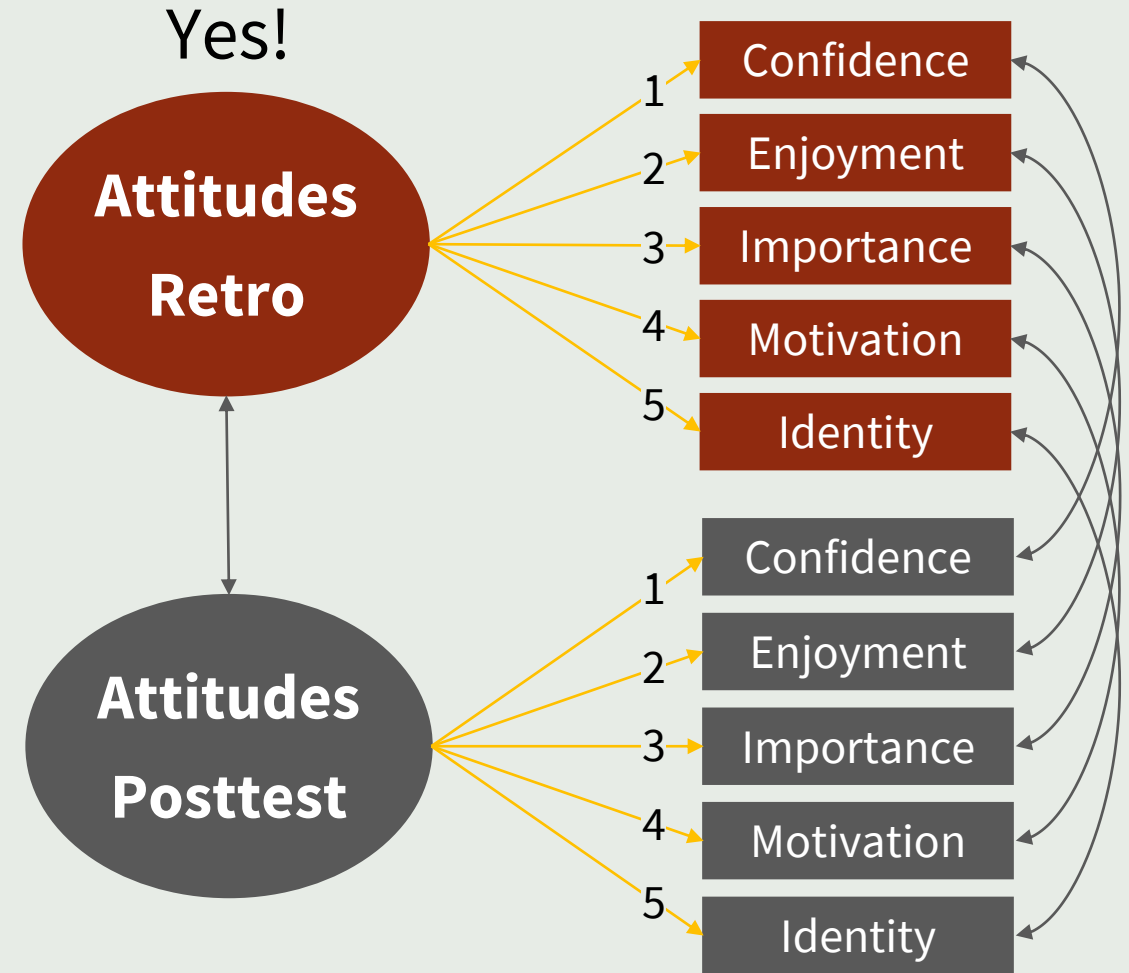
<b>Invariance</b>	<b>What is constrained?</b>	<b>If variant, which response shift bias?</b>
<b>Configural</b>	Nothing	Reconceptualization
<b>Weak</b>	Factor Loadings	Reprioritization



# Weak Invariance



$\Delta\chi^2 (4) = .75$ ,  $\Delta CFI = .00$ ,  $\Delta RMSEA = .00$ ,  $\Delta SRMR = .00$

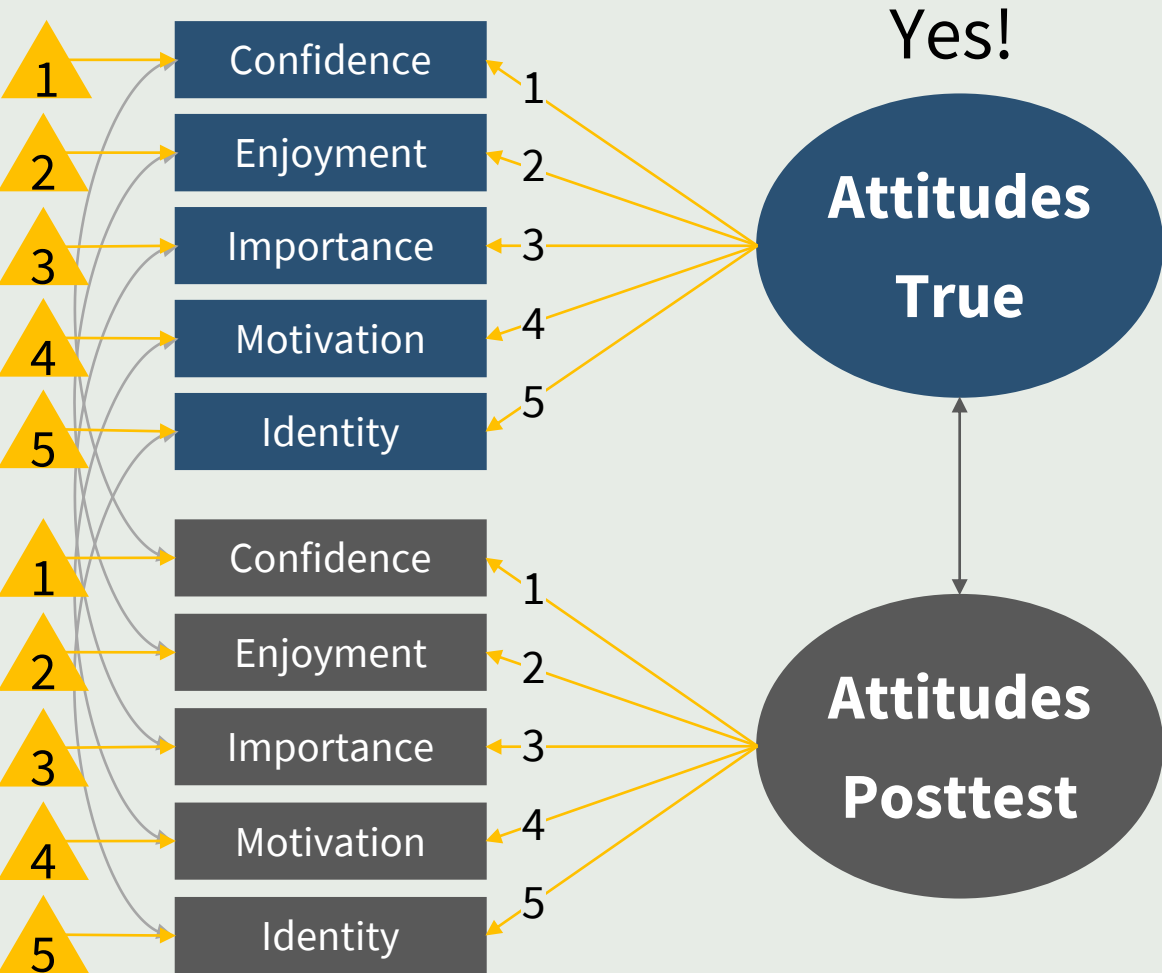


$\Delta\chi^2 (4) = 4.64$ ,  $\Delta CFI = .00$ ,  $\Delta RMSEA = .00$ ,  $\Delta SRMR = .00$

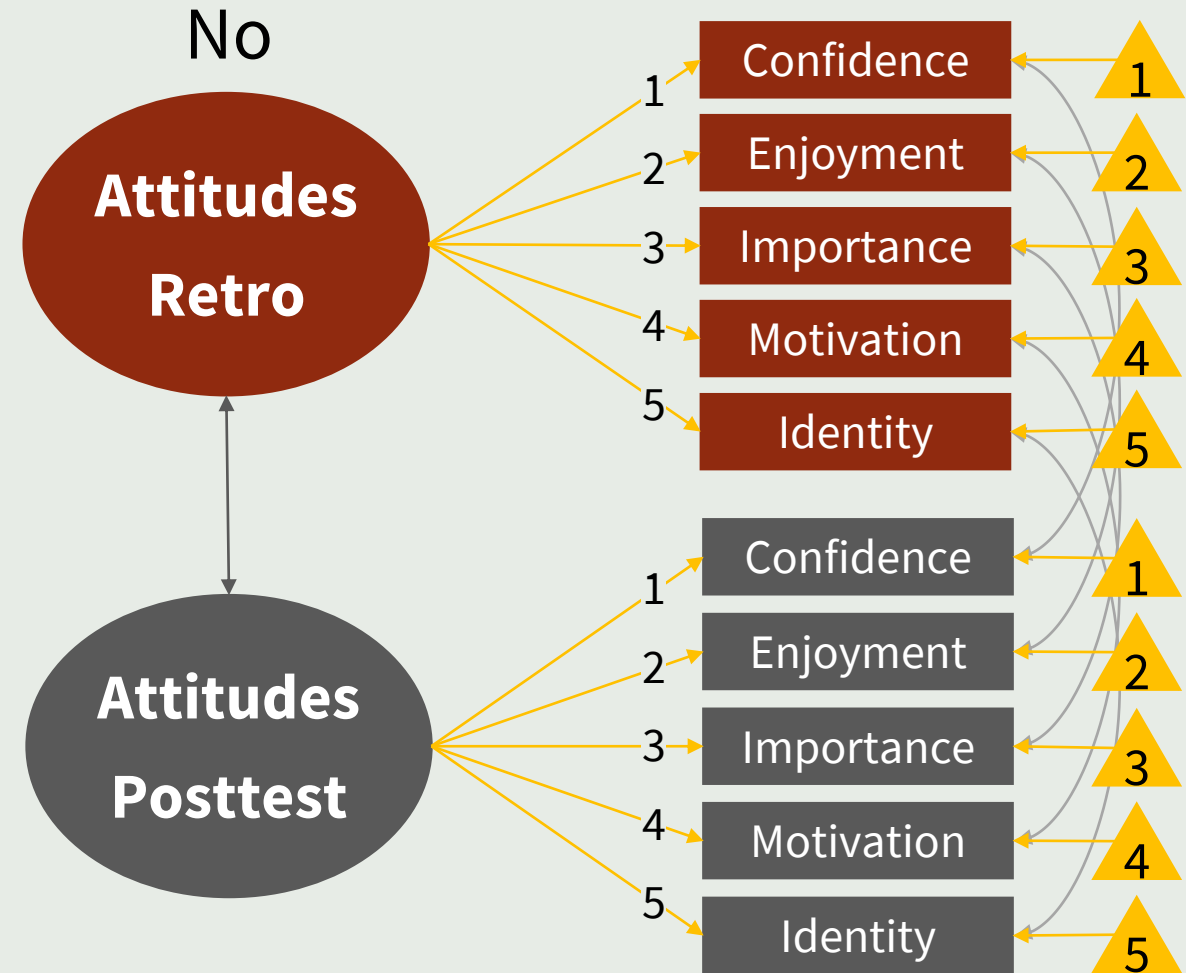
# Measurement Invariance

<b>Invariance</b>	<b>What is constrained?</b>	<b>If variant, which response shift bias?</b>
<b>Configural</b>	Nothing	Reconceptualization
<b>Weak</b>	Factor Loadings	Reprioritization
<b>Strong</b>	Intercepts	Uniform Recalibration

# Strong Invariance



$$\Delta\chi^2(4) = 23^{***}, \Delta\text{CFI} = .00, \Delta\text{RMSEA} = .01, \Delta\text{SRMR} = .01$$

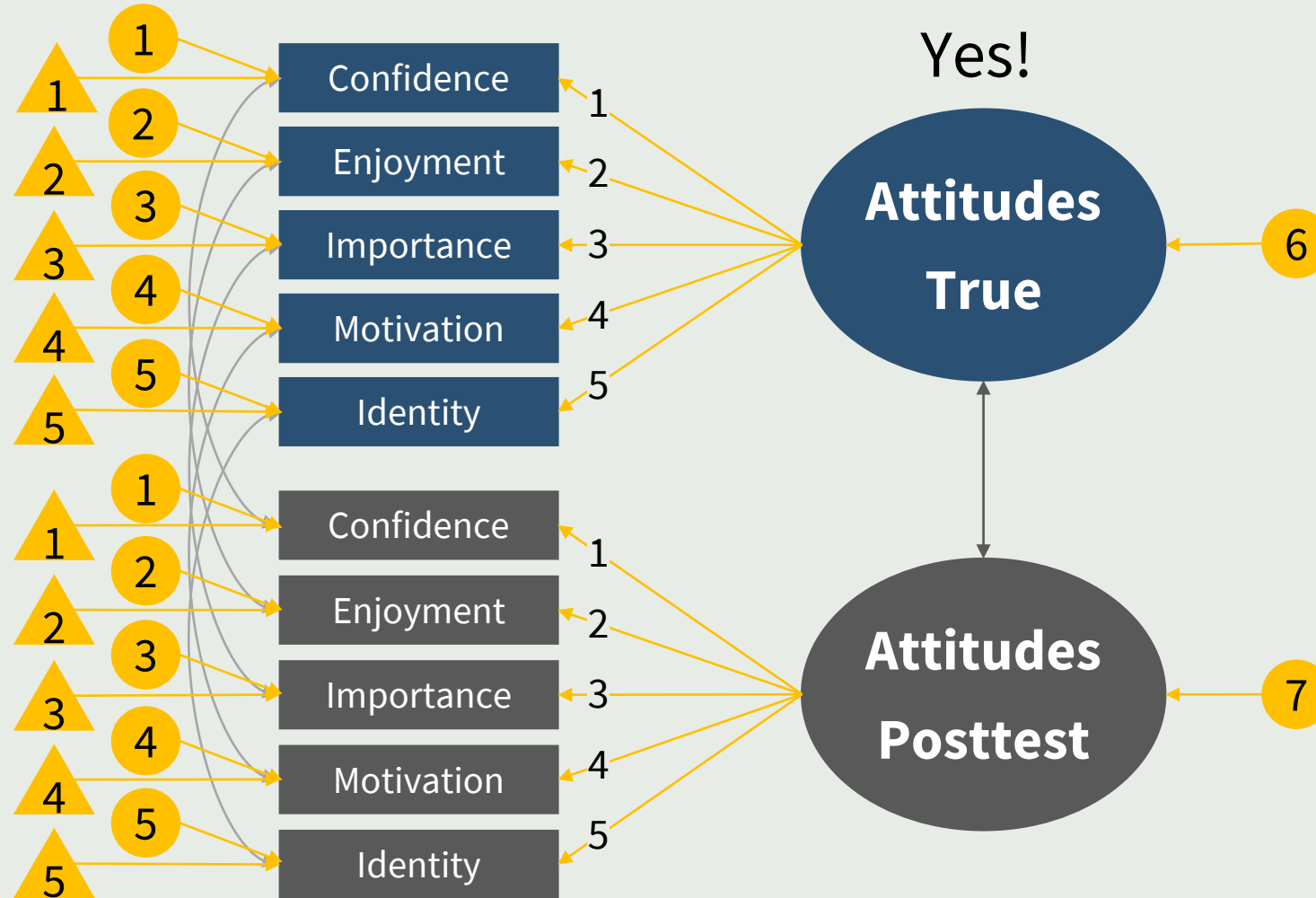


$$\Delta\chi^2(4) = 122^{***}, \Delta\text{CFI} = .03, \Delta\text{RMSEA} = .03, \Delta\text{SRMR} = .04$$

# Measurement Invariance

<b>Invariance</b>	<b>What is constrained?</b>	<b>If variant, which response shift bias?</b>
<b>Configural</b>	Nothing	Reconceptualization
<b>Weak</b>	Factor Loadings	Reprioritization
<b>Strong</b>	Intercepts	Uniform Recalibration
<b>Strict</b>	Variances	Non-Uniform Recalibration

# Strict Invariance



$\Delta\chi^2(6) = 11, \Delta CFI = .00, \Delta RMSEA = .01, \Delta SRMR = .00$

# Measurement Invariance

Invariance	True Pretest	Retrospective Pretest
<b>Configural</b>	Yes	Yes
<b>Weak</b>	Yes	Yes
<b>Strong</b>	Yes	No <b>Uniform Recalibration</b>
<b>Strict</b>	Yes <b>No Response Shift Bias</b>	--

# Implications

1. Not sure if you have response shift bias? Check using measurement invariance techniques!
2. Supplement with qualitative data
3. Consider the timing & placement of the retrospective pretest
  - Before or after the posttest?
  - On the same or a different page as the posttest?
  - On the same or a different questionnaire as the posttest?

# References & Contact

Bialosiewicz, Murphy, & Berry (2013) An introduction to measurement invariance testing: Resource packet for participants. Available on the AEA Public eLibrary.

Piwovar & Thiel (2014) Evaluating response shift in training evaluation: Comparing the retrospective pretest with an adapted measurement invariance approach in a classroom management training program. *Evaluation Review*, 38(5), 420-448.

Jorgensen, Pornprasertmanit, Schoemann, & Rosseel (2019) semTools. R package version 0.5-2

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