

(Bob Pearson's Cheat Sheet for)
SCALE VALIDATION

- I) Item analysis
 - A) Frequencies (univariate descriptives)
 - 1) include mean, med, std, min, max, skew, kurtosis
 - 2) skim maximums for typos (e.g. 11 or 22 for value of 5-point scale)
 - 3) Skim the SD. Item with too little variability will hurt the scale. For 5-point likert scale items, flag and examine SDs well below 1
 - 4) Check that items are roughly normal-ish. Examine:
 - (i) Skew should be within (-1, 1)
 - (ii) Kurtosis should be within (-1, 2)
 - (iii) Might also skim item histograms.
 - 5) Check missing value counts
 - B) Recode values as needed (e.g. reverse scoring some items)
- II) Structure - Use factor analysis (FA) to examine the correlation structure among items. There are several important FA decisions:
 - A) Identifying the number of factors
 - 1) Eigenvalues >1 (Kaiser-Guttman criterion) – should only be considered a rough estimate, and probably overestimate. The poor performance of this rule is well known.
 - 2) Scree plot – useful if there is a clear elbow. This should be preferred to $EV > 1$
 - 3) Suggestion: check multiple factor solutions for interpretability and theoretical considerations
 - B) Extraction Method – Use method that most fits your theory
 - 1) Principal Components (PCA)
 - (i) Explains maximum amount of variance
 - (ii) Assumes variables are perfectly measured
 - (iii) more appropriate for data reduction than identifying underlying factors
 - 2) Common Factor Methods, usually abbreviated EFA (e.g. MLFA, PAF)
 - (i) Examines only the common variance and excludes variance unique to each variable
 - (ii) Factor loadings are more likely to replicate across studies
 - 3) Suggestion – For most psychometric applications, use EFA instead of PCA
 - C) Rotation
 - 1) Major choice: oblique vs. orthogonal
 - (i) Orthogonal (varimax)
 - (a) Factors not allowed to correlate in model
 - (b) simpler model (easier to interpret in some ways)
 - (ii) Oblique (e.g. promax)
 - (a) Allows factors to be correlated
 - (b) may result in simpler structure (easier to interpret loadings)

- (c) Examine pattern matrix to identify and name factors
- (d) Also examine estimates of the inter-factor correlations for each considered solution
- (e) Then also examine the structure matrix for your final solution to gain greater insight.
- (f) Factor correlations can be also factor analyzed (higher order FA)
- (iii) Suggestion – try oblique first, but if factors appear weakly correlated then use orthogonal

III) Reliability

- A) Run on subscales if you believe them to exist
 - 1) possibly based on EFA
 - 2) any set of items for which you plan to use the mean or sum
- B) Use assumes that the set of items measures one trait (items are unidimensional).
 - 1) So if subscales are present, reliability analysis of the entire scale violates this assumption
- C) Methodology
 - 1) Use Cronbach's alpha (internal consistency). This is equivalent to KR-20 if items are dichotomous
 - 2) Examine "scale if item deleted" – compare to current estimate
 - 3) Remove items (one at a time) if doing so substantially improves reliability, unless they are "integral" to scale

IV) General advice - "Bad" items will generally be identifiable in multiple ways: low loadings, hurt the scale reliability, low variance, skewed, etc.)