

# Basic Concepts of Classical Test Theory

Lecture 9  
Feb 28, 2019

CLPS 2908  
Multivariate Statistical Techniques

## 1. Test Components

- A “test” is
  - any variable, item, trial
  - though often a multi-item scale or measure.
- Every test has a **true-score** component and an **error** component

$$x_i = T_i + e_i$$

**measurement = latent/true score + error**

*latent score ≈ average score on universe of items*

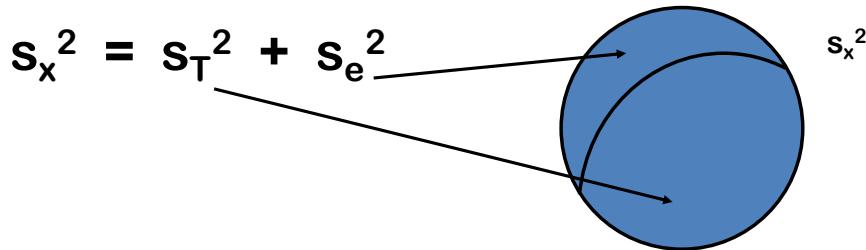
**DEFINE:**  $T = \text{ev}(x)$  and **DEFINE:**  $e = x - T$

**Then**  $\text{ev}(e) = \text{ev}(x - T) = \text{ev}(x) - \text{ev}(T) = T - T = 0$ ; hence  **$\text{ev}(e) = 0$**

## 2. Variance of a Test

$$x = T + e$$
$$s_x^2 = s_T^2 + s_e^2 + 2\text{cov}_{T,e}$$

- By assumption, **errors** (random variable) and **true score** (constant) are uncorrelated, hence  $\text{cov}_{T,e} = 0$



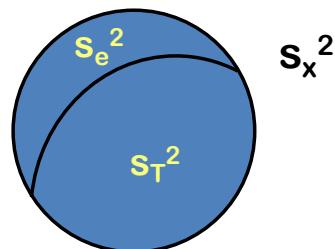
## 3. Reliability

= the proportion of **true score** variance out of **total measured variance**:

$$\frac{s_T^2}{s_x^2}$$

or :  $1 - \frac{s_e^2}{s_x^2}$

= the proportion of **nonerror** variance



Look familiar? Total variance, explained variance....

## Deriving Reliability (Nunally)

Aim: assess item's *representativeness* of true score,  $r_{iT}$

If  $\bar{r}_{ij}$  for any item  $X_i$  with all other  $X_j \approx$  constant, then

$$\bar{r}_{ij} = r_{i\sum i}^2 = r_{iT}^2 \quad \boxed{\text{pp. 176-177}}$$

If reliability measure (written as  $r_{xx}$ ) can estimate  $\bar{r}_{ij}$ ,  
then  $r_{xx} \approx r_{iT}^2$   
= variance of all  $X_i$  explained by  $T$ .

Thus, reliability is  $S_T^2 / S_x^2$ .

## 3. Reliability (cont'd)

= the proportion of true-score variance  $\frac{S_T^2}{S_x^2}$   
out of total measured variance

- Types of reliability estimates
  - Test re-test (canceling *context*-specific  $s_e^2$ )
  - Split-half (canceling *item*-specific  $s_e^2$ )
  - Internal consistency → Cronbach's  $\alpha$
  - Inter-rater agreement

## 4. Formulas

Spearman-Brown  
“prophecy” formula for  
varying test length

1	2	3	4	5	6	7	8	9	10

Standardized  
Cronbach's  $\alpha$ :

$$r_{new} = \frac{N r_{old}}{1 + (N - 1)r_{old}}$$

$$\frac{k \bar{r}_{ij}}{1 + (k - 1)\bar{r}_{ij}}$$

“Represents the expected correlation  
of one test with an alternative form  
containing the same number of items”

$$= \frac{k}{k-1} \left[ 1 - \frac{\sum \sigma_k^2}{\sigma_{Total}^2} \right]$$

SPSS  
provides both

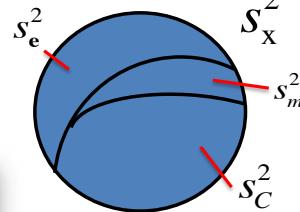
$N$  is the factor by which you  
lengthen the test. So if  $N = 2$ , the  
number of items doubles.

## 5. Misconceptions

- “True score” does not necessarily mean you are “truly” (validly) measuring **construct** of interest.
- $s_T^2$  isn’t pure construct variance  $s_c^2$ .
  - Method variance,  $s_m^2$  is measured in  $s_T^2$  as well
  - So are response biases, stable context, etc.
- Reliability ≠ accuracy of point estimation (Rogosa)
  - Shoe size distribution + variance
  - If  $s_x^2$  is large,  $s_e^2$  is still considerable, even if reliability is  $> .80$

$$s_T^2 = 4.21, s_e^2 = 1.0, \text{ therefore } s_x^2 = 5.21$$

$$r_{xt} = 4.21/5.21 = 0.808$$



## 6. How to Increase Reliability

- Write items clearly
- Remove ambiguous or multi-part items
- Remove items with unfamiliar content
- Make test instructions easy to understand
- Standardize conditions for administration
- Minimize fatigue effects (shorter, interesting test)
- Make test longer (use “prophecy formula”)
  - but shortening the test may focus on the best items
- If applicable, train raters (minimize guessing, subjective judgments)

*Thanks to Gerard Saucier!*

## 7. Basics of Item Analysis

- Item sampling, test construction
- Item selection → first run
  - Item-total correlations, inter-item correlations
  - Internal consistency ( $\alpha$ )
  - How much homogeneity is desirable?
  - Multi-dimensionality → PCA (or item grouping)
- Item exclusion → next run

[See SPSS output examples](#)

### Warnings

RELIAB VAR = anxious tense disorgan shy  
 harsh quiet lax  
 /SCALE (AGREEABLENESS) = anxious tense  
 disorgan shy harsh  
 quiet lax  
 /STA = CORR  
 /SUM = TOTAL CORR.

The covariance matrix is calculated and used in the analysis.

### Case Processing Summary

		N	%
Cases	Valid	234	80.1
	Excluded(a)	58	19.9
	Total	292	100.0

a Listwise deletion based on all variables in the procedure.

### Reliability Statistics

Cronbach's Alpha	Cronbach's Alpha Based on Standardized Items	N of Items
.572	.565	7

### Inter-Item Correlation Matrix

	anxious	tense	disorgan	shy	harsh	quiet	lax
anxious	1.000	.677	.058	.156	.154	.271	-.055
tense	.677	1.000	.026	.206	.223	.239	-.161
disorgan	.058	.026	1.000	.096	.146	.032	.350
shy	.156	.206	.096	1.000	.004	.712	.062
harsh	.154	.223	.146	.004	1.000	.003	.038
quiet	.271	.239	.032	.712	.003	1.000	.041
lax	-.055	-.161	.350	.062	.038	.041	1.000

The covariance matrix is calculated and used in the analysis.

### Summary Item Statistics

	Mean	Minimum	Maximum	Range	Maximum / Minimum	Variance	N of Items
Inter-Item Correlations	.156	-.161	.712	.873	-4.425	.045	7

The covariance matrix is calculated and used in the analysis.

	Scale Mean if Item Deleted	Scale Variance if Item Deleted	Corrected Item-Total Correlation	Squared Multiple Correlation	Cronbach's Alpha if Item Deleted
anxious	25.44	35.646	0.401	0.482	0.491
tense	25.96	35.921	0.382	0.503	0.499
disorgan	26.50	38.448	0.199	0.152	0.574
shy	26.02	35.171	0.394	0.522	0.492
harsh	26.97	41.815	0.170	0.074	0.573
quiet	25.96	35.260	0.422	0.536	0.483
lax	26.49	43.496	0.091	0.160	0.597