

Options for Analyzing a One-Way Within-Subject
 Design with Replications

Assume 5 levels of factor A, 3 participants who complete 4 replications of each of the 5 levels of factor A (20 observations per participant; 60 observations in the whole experiment).

- A. Average each participant's responses within treatment condition. Now we have 5 observations per person, one for each level of factor A. It is now analyzed as a regular one-way within-subject design.
 Subjects is random; A is fixed.

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + a\sigma_S^2 + an\mu^2$
Subjects	$n - 1 = 2$	$\sigma_e^2 + a\sigma_S^2$
A	$a - 1 = 4$	$\sigma_e^2 + \sigma_{SxA}^2 + n\theta_A^2$
A x S	8	$\sigma_e^2 + \sigma_{SxA}^2$

Linear model:

$$Y_{ij} = \mu + \alpha_j + \pi_i + \alpha\pi_{ij} + \varepsilon_{ij}$$

ε_{ij} can't be separated from $\alpha\pi_{ij}$

- B. Consider replications to be random and nested in Subject x A combinations. Subjects is also random.

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + ar\sigma_S^2 + anr\mu^2$
Subjects	$n - 1 = 2$	$\sigma_e^2 + ar\sigma_S^2$
A	$a - 1 = 4$	$\sigma_e^2 + r\sigma_{Axs}^2 + rn\theta_A^2$
A x S	$(a-1)(n-1) = 8$	$\sigma_e^2 + r\sigma_{Axs}^2$
Reps/AS	$an(r - 1) = 45$	σ_e^2

B'. Replications is random and nested in S x A combinations, but subjects is fixed.

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + anr\mu^2$
Subjects	n - 1	$\sigma_e^2 + ar\theta_S^2$
A	a - 1	$\sigma_e^2 + nr\theta_A^2$
A x S	(a-1)(n-1)	$\sigma_e^2 + r\theta_{A \times S}^2$
R/AS	an(r - 1)	σ_e^2

C. Consider replications to be a fixed factor crossed with other factors. Subjects is random. This analysis allows Repls to be tested.

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + ar\sigma_S^2 + anr\mu^2$
Subjects	n - 1	$\sigma_e^2 + ar\sigma_S^2$
A	a - 1	$\sigma_e^2 + r\sigma_{A \times S}^2 + ar\theta_A^2$
A x S	(a-1)(n-1)	$\sigma_e^2 + r\sigma_{A \times S}^2$
Repls	r - 1	$\sigma_e^2 + a\sigma_{R \times S}^2 + an\theta_R^2$
R x S	(r-1)(n-1)	$\sigma_e^2 + a\sigma_{R \times S}^2$
A x R	(a-1)(r-1)	$\sigma_e^2 + \sigma_{A \times R \times S}^2 + n\theta_{A \times R}^2$
A x R x S	(a-1)(r-1)(n-1)	$\sigma_e^2 + \sigma_{A \times R \times S}^2$

D. Analyze the data of each subject in a separate ANOVA. Replications is a random factor in each analysis, nested in treatment. This allows the effect of factor A to be tested for each individual.

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + ar\mu^2$
A	a - 1	$\sigma_e^2 + r\theta_A^2$
Repls/A	a(r - 1)	σ_e^2

D'. Individual subject ANOVAs; Replications is random and crossed with factor A (factor A is fixed).

<u>Source</u>	<u>df</u>	<u>E(MS)</u>
Mean	1	$\sigma_e^2 + a\sigma_R^2 + ar\mu^2$
Reps	$r - 1$	$\sigma_e^2 + a\sigma_R^2$
A	$a - 1$	$\sigma_e^2 + \sigma_{AxR}^2 + r\theta_A^2$
A x R	$(a-1)(r-1)$	$\sigma_e^2 + \sigma_{AxR}^2$

Comments:

- A. In this approach, reps are not of interest. By averaging reps together for each subject, the scores to be analyzed will have more stability. Variance due to replications is averaged away.
- B. & B'. In these approaches, reps is also not of interest, but it becomes the error term for at least one test. The interaction of treatment (A) with Subjects can be tested. Subjects can also be tested. A question for BN is when it might be legitimate to consider subjects to be a fixed factor.
- C. In this approach, reps is a factor that the investigator is interested in testing, along with its interaction with the treatment effect.
- D. & D'. In these approaches the focus is on individual differences in the effect of factor A. Do some subjects show a treatment effect whereas others do not? There is a design issue in considering reps to be nested vs. crossed. Nested would be implied by a totally random order of the trials of the experiment. Crossed seems to be implied by a design in which all of the trials of the first replication are completed before the second replication, etc. What are the implications of crossed versus nested for statistical power?

Four Alternatives for Analyzing Massaro and Anderson design (*American Journal of Psychology*, 1970)

Data averaged over reps.		Reps. nested within SOLA		Reps. treated as factor		Single subject analysis	
<u>Source</u>	<u>df</u>	<u>Source</u>	<u>df</u>	<u>Source</u>	<u>df</u>	<u>Source</u>	<u>df</u>
Mean	1	Mean	1	Mean	1	Mean	1
Subjects	15	Subjects	15	Subjects	15	Orientation	1
Orientations	1	Orientations	1	Orientations	1	Length	1
SxO	15	SxO	15	SxO	15	Angle	4
Length	1	Length	1	Length	1	OxL	1
SxL	15	SxL	15	SxL	15	OxA	4
Angle	4	Angle	4	Angle	4	LxA	4
SxA	60	SxA	60	SxA	60	OxLxA	4
OxL	1	OxL	1	OxL	1	Reps/OLA	<u>80</u>
SxOxL	15	SxOxL	15	SxOxL	15		100
OxA	4	OxA	4	OxA	4		
SxOxA	60	SxOxA	60	SxOxA	60	Cells for systematic	
LxA	4	LxA	4	OxT	4	sources = 20	
SxLxA	60	SxLxA	60	SxOxT	60		
OxLxA	4	OxLxA	4	LxA	4	5 reps per cell = 100 obs.	
SxOxLxA	<u>60</u>	SxOxLxA	60	SxLxA	60		
	320	Reps/SOLA	<u>1280</u>	LxT	4		
			1600	SxLxT	60		
Cells for systematic		Cells for systematic		AxT	16		
sources = 2 orientations		sources = 20		SxAxT	240		
x 2 lengths x 5 angles = 20		20 cells x 5 trials = 100 per S		OxLxA	4		
20 scores per S x 16 S =		100 scores per S x 16 S =		SxOxLxA	60		
320 obs.		1600 obs.		OxLxT	4		
				SxOxLxT	60		
		Reps is random		OxAxT	16		
		S is random		SxOxAxT	240		
				LxAxT	16		
				SxLxAxT	240		
				OxLxAxT	16		
				SxOxLxAxT	<u>240</u>		
					1400		

Cells for systematic sources = 20 x 5 trials = 100
 100 scores per S x 16 S = 1600 obs.