## Two-way Analysis of Variance (ANOVA)

Between-subjects designs

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## Έλεγχος υποθέσεων-Βήματα

- 1. Καθορίζεται η μηδενική υπόθεση Η0 ( = ) και εναλλακτική υπόθεση Η1 ( ≠ ).
- 2. Ορίζεται το επίπεδο σημαντικότητας α (συνήθως α=0.05).
- 3. Επιλέγεται μια κατάλληλη **στατιστική δοκιμασία** και υπολογίζεται η τιμή του στατιστικού με βάση τα δεδομένα του δείγματος.
- 4. Σύγκριση της **πιθανότητας p** να έχουμε την συγκεκριμένη τιμή του στατιστικού (ή κάτι πιο ακραίο) θεωρώντας ότι ισχύει η Ho, με το **επίπεδο σημαντικότητας α** (0.05). Στατιστικά σημαντικό αποτέλεσμα (p <0.05).
- **5. Ερμηνεία** αποτελεσμάτων.

```
ANOVA: Y = numeric variable  
Dependent

X<sub>1</sub> = categorical (factor A) variable Independent

X<sub>2</sub> = categorical (factor B) variable Independent
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#### **EXAMPLE**

Assume that researchers are interested in exploring the role of **analogical thinking** in the **problem-solving skills** of **children and adolescents**.

Y: Number of mistakes made while attempting to solve the problems

X1: intervention control group, exp. group 1 (exposure to similar examples), and exp. group 2 (exposure + instructions)
X2: school age (primary school, secondary school)

#### **Null and alternative hypotheses**

#### Main effect: intervention

- $H_0$ : There is no significant difference in number of mistakes between intervention groups (  $\mu_{control}=\mu_{exper1}=\mu_{exper2})$
- $H_1$ : At least one intervention has a significantly different mean number of mistakes.

#### Main effect: school age

- $H_0$ : There is no significant difference in number of mistakes between primary and secondary school. ( $\mu_{primary} = \mu_{secondary}$ )
- $H_1$ : There is a significant difference in number of mistakes between primary and secondary school ( $\mu_{primary} \neq \mu_{secondary}$ ).

#### Interaction effect between intervention and school age

- $H_0$ : There is no interaction effect between intervention and school age on number of mistakes (i.e., the effect of intervention on number of mistakes does not depend on school age).
- $H_1$ : There is a significant interaction effect between intervention and school age on number of mistakes (i.e., the effect of intervention on number of mistakes varies depending on school age).

## Assumptions of two-way between-subjects ANOVA

- Between-subjects design
- **Normality:** The number of mistakes should be approximately normally distributed within each group (i.e., for each combination of intervention and school age).
  - Check the residuals (Shapiro-Wilk test)

- Homogeneity of Variance (Homoscedasticity): The variance of number of mistakes should be approximately equal across all groups.
  - Check for homogeneity of variances (Levene's test)

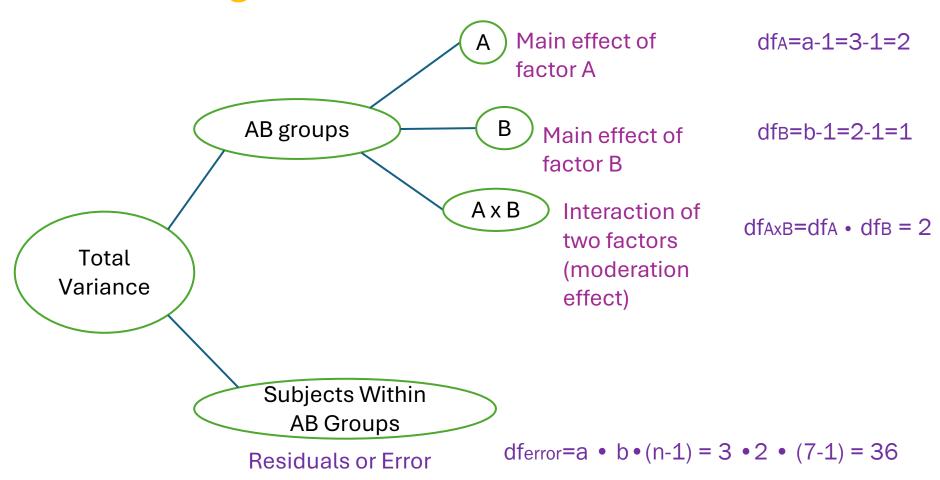
## **DATA (3x2)**

#### **How it works**

			Factor A			MEAN
			control	exp1	exp2	
	Secondary		38	20	10	
			47	20	8	
			42	22	12	
			37	24	5	
			33	32	6	
			31	19	0	
			33	36	0	
		Mean	37.3	24.7	5.9	22.6
) 	Primary		34	29	37	
1			39	47	45	
			37	28	48	
			26	43	29	
			46	41	34	
			40	44	32	
			27	31	51	
		Mean	35.6	37.6	39.4	37.5
		MEAN	36.4	31.1	22.6	<mark>30.1</mark>

Factor B

#### Partitioning the total variance into its sources



### Interaction

An interaction occurs when the effect of one factor changes according to the level of the other factor.

E.g., the number of mistakes in the exposure-to-examples group is lower among secondary school students than among primary school students.

#### **ANOVA TABLE (two-factors with interaction)**

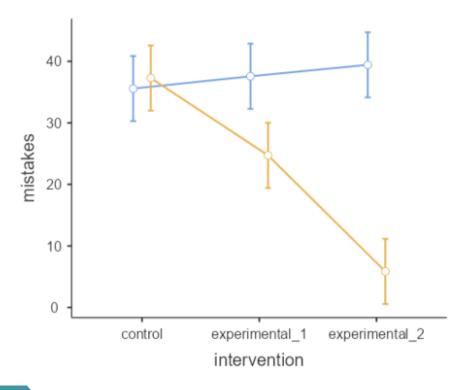
	ANOVA - mistakes						
		Sum of Squares	df	Mean Square	F	р	η²
Main effect A	intervention	1354.429	2	677.214	14.217	< .001	0.178
Main effect B	school_age	2332.595	1	2332.595	48.968	< .001	0.307
Interaction	intervention * school_age	2200.905	2	1100.452	23.102	< .001	0.289
	Residuals	1714.857	36	47.635			

A key principle in interpreting and reporting factorial analysis results is that **interactions** take precedence over main effects.



Conduct a **simple effects** analysis

#### Simple effects analysis



school\_age

- primary
- secondary

#### ANOVA for Simple Effects of intervention

Moderator	_				
school_age	F	Num df	Den df	р	η²p
primary	0.547	2	36	0.584	0.029
secondary	36.772	2	36	< .001	0.671

#### ANOVA for Simple Effects of school\_age

Moderator					
intervention	F	Num df	Den df	р	η²p
control	0.216	1	36	0.645	0.006
experimental_1	12.146	1	36	0.001	0.252
experimental_2	82.810	1	36	< .001	0.697

## **Post hoc Tests**

- Bonferroni Procedure
- Tukey's Test
- Scheffe
- Holm