

# Analysis of Variance (ANOVA)



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Hiroataka Onishi, MD, MHPE, PhD

Dept. of International Cooperation for Medical Education,  
International Research Center for Medical Education,  
Graduate School of Medicine, The University of Tokyo



# What Is $H_0$ Meaning?

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- $H_0: \bar{x}_1 = \bar{x}_2 = \bar{x}_3$
- Even if  $H_0$  is rejected, it does not automatically mean  $x_1 < x_2$  or  $x_2 < x_3$
- To prove the difference between specific two variables, post-hoc tests will be used.
  - Scheffé test: most stringent
  - Bonferroni:  $\alpha$  is divided by the number of tests.
  - Tukey's Honestly Significant Difference (HSD): numbers of cases must be the same



# Differentiate Within-subject from Between-subject Data

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- Within-subject data
  - Longitudinally (repeatedly) collected data
  - Multiple items in a questionnaire
- Between-subject
  - Different groups of subjects
    - Demographic data: Gender, age group...
    - Study vs control groups

# Data Format

control	APN phone	APN ph + visits
1	7	5
3	4	8
2	2	6
2	3	9
3	9	7
5	4	9
7	4	10
4	8	8
2	6	7
1	5	10
$\bar{x} = 3.0$	$\bar{x} = 5.2$	$\bar{x} = 7.9$
sd = 1.89	sd = 2.25	sd = 1.66

Untitled - SPSS Data Editor

File Edit View Data Transform

16 :

	score	gr	var	var
1	1	1		
2	3	1		
3	2	1		
4	2	1		
5	3	1		
6	5	1		
7	7	1		
8	4	1		
9	2	1		
10	1	1		
11	7	2		
12	4	2		
13	2	2		
14	3	2		
15	9	2		
16	4	2		
17	4	2		
18	8	2		
19	6	2		
20	5	2		
21	5	3		
22	8	3		
23	6	3		
24	9	3		
25	7	3		
26	9	3		
27	10	3		
28	8	3		
29	7	3		
30	10	3		
31				

# Data Format

- In SPSS or Excel
  - Within-subject data are put in parallel  → You have to define the group to conduct the analysis
  - Between-subject data are put in tandem

Nation	HiB	HiY	HiR
1	10	6	19
1	12	11	16
1	9	8	19
1	10	9	19
2	8	7	20
2	10	7	20
2	8	9	16
2	9	9	19
3	8	15	9
3	7	19	6
3	11	14	6
3	7	18	8



# Select Post-hoc Test

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When three or more options are

- Within-subject
  - Sidak is often selected
- Between-subject
  - Tukey is one of the most frequently used post-hoc test



# Sphericity

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- If within-subject data has three or more options, sphericity might be a problem.
  - When “test of homogeneity of variances” is significant, 3 Steps will be taken:
    - (1) sphericity supposed
    - (2) lowest, and
    - (3) Greenhouse-Geisser’s modification

# Interaction

	Male	Female	
Young	5	10	15
Old	10	5	15
	15	15	

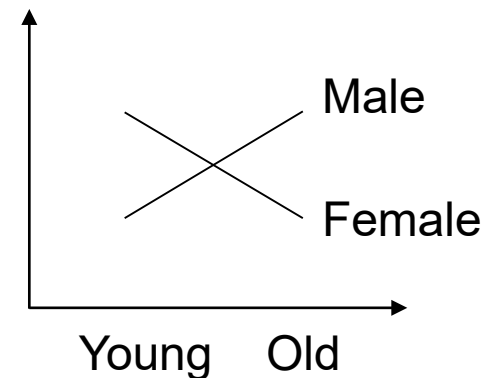
Main effect for Age

Main effect for Sex

$$H_0: \mu_{\text{male}} = \mu_{\text{female}}$$
$$H_1: H_0 \text{ is false}$$

$$H_0: \text{There is no interaction}$$
$$H_1: H_0 \text{ is false}$$

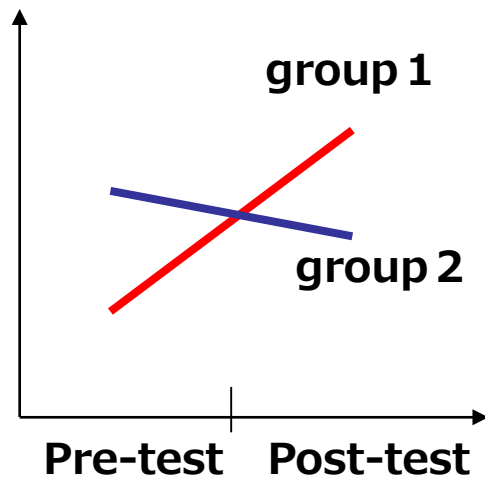
$$H_0: \mu_{\text{young}} = \mu_{\text{old}}$$
$$H_1: H_0 \text{ is false}$$



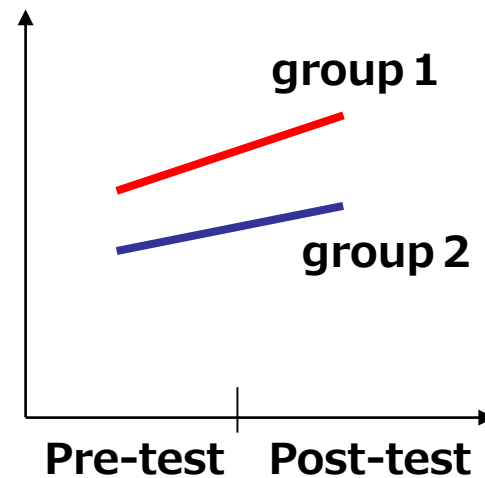


# 2way, 3way ANOVA

- More than one factors are compared simultaneously.
- Both within-subject and between subject data are combined for one analysis.
- Interaction is another issue for 2way ANOVA or more.



With interaction



Without interaction

検定・分析の種類別の代表的な効果量の指標と大きさの目安

使用される検定 (分析)	対象と注意	効果量の指標	効果量の目安		
			小 (Small)	中 (Medium)	大 (Large)
相関分析		$r$	.10	.30	.50
重回帰分析		$R^2$	.02	.13	.26
		$f^2$	.02	.15	.35
$t$ 検定 ( $t$ -test)	$r$ と $d$ は 対応ありの場合 は注意	$r$	.10	.30	.50
		$d$	.20	.50	.80
		$\eta^2$	.01	.06	.14
一元配置分散分析 (One-way ANOVA)	全体の検定	partial $\eta^2$	-	-	-
		$\omega^2$	.01	.09	.25
		$f$	.10	.25	.40
	多重比較	$r$	.10	.30	.50
		$d$	.20	.50	.80
二元配置分散分析 (Two-way ANOVA)	主効果	$\eta^2$	.01	.06	.14
		partial $\eta^2$	-	-	-
		$\omega^2$	.01	.09	.25
多元配置分散分析* (Multi-way ANOVA) *三元配置以上の分散分析	交互作用	$\eta^2$	.01	.06	.14
		partial $\eta^2$	-	-	-
		$\omega^2$	.01	.09	.25
	多重比較	$r$	.10	.30	.50
		$d$	.20	.50	.80



# Exercise 1

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- Open 2wayANOVA.xlsx
- Seek for the relationship (1) age (2) # of delivery and (3) sex of the baby (1 male, 0 female)

対馬栄輝. SPSSで学ぶ医療系データ解析：分析内容の理解と手順解説、  
バランスのとれた医療統計入門. pp166-174



## Exercise 2

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- Open repANOVA.xlsx
- 23 young subjects measured height in 3 consecutive years.
- Are they growing?
- Change in the data format might be needed.



# Exercise 3

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- Open water learning.xlsx
- 9 divers participated in the experiments of learning words in 8 conditions
  - 1<sup>st</sup> digit: reproduction–1, reaffirmation–2
    - Reproduction: recall what was experienced as it was
    - Reaffirmation: confirm that what is being questioned is what was experienced.
  - 2<sup>nd</sup> digit: learning on the ground–1, in the water–2
  - 3<sup>rd</sup> digit: testing on the ground–1, in the water–2



# Exercise 4

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- Open MixedANOVA.xlsx
- 12 workers from 3 countries (Japan – 1, Korea – 2, US – 3) participated in the physical exercise.
- Conditions
  - Color lighting: blue, red and yellow
  - Temperature: high, normal and low