

# Week 5



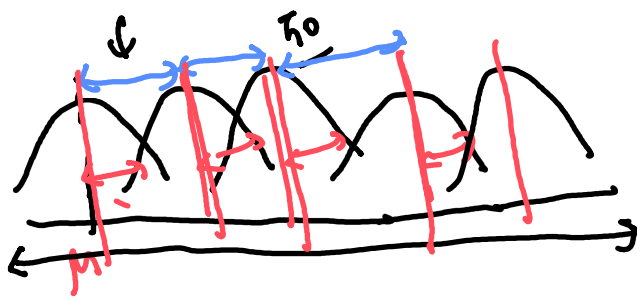
two-sample t-test  $[H_0: \mu_M = \mu_F \text{ vs. } H_1: \mu_M \neq \mu_F]$   
*no gender effect*

ANOVA

$H_0: \mu_F = \mu_M$	$H_a: \mu_F \neq \mu_M$
$H_0: \mu_A = \mu_B = \mu_W$	$H_a: \text{race}$
$H_0: \text{no interaction effect}$	

	<div style="display: flex; justify-content: space-around;"> <span>B</span> <span>A</span> </div>		
F	(W.F)	(B.F)	(A.F)
M	(W.M)	(B.M)	(A.M)

$Y_{(Fiw)i} = \underbrace{\mu_{(Fiw)}}_{\text{fixed unknown}} + \underbrace{\text{Error}}_{\text{individual specific}}$   
 $= \mu_0 + \mu_F + \mu_W + \mu_{FW} + \text{Error}$



$\mu_{(A,M)} = \mu_0 + \mu_A + \mu_M + \mu_{AM}$

## Model Assumptions

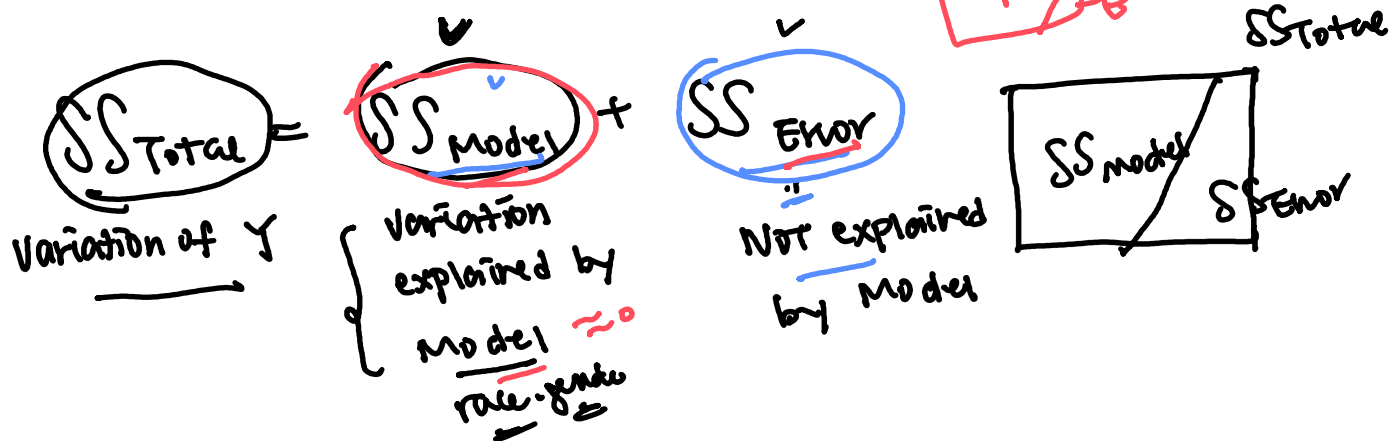
- (1) Y is continuous numeric
- (2) Data ~ Normal
- (3) Equal variance → if it is violate → Welch's ANOVA
- (4) indep samples



- ANOVA
  - (1) Test main or interaction effect
  - (2)  $R^2 = \frac{SS_{\text{model}}}{SS_{\text{total}}}$
  - (3) post-hoc test

(4) Model diagnostics

- Normality
- Equal variance



1-way ANOVA: Toothlength ~ (Dose) (0.5 / 1 / 2)

$$SS_{\text{Total}} = SS_{\text{Dose}} + SS_{\text{Error}}$$

$$F = \frac{SS_{\text{Model}} (= \text{Dose}) / df(D)}{SS_{\text{Error}} / df(E)}$$

$(F)^\uparrow$   
 $F \approx 0$

$M_{(F,w)}$   
 $\hat{M}_{(F,w)}$

sample 50

Model diagnostics  $\Rightarrow$  Residuals  $\approx$  Error

$$Y_{(F,w)i} - \hat{M}_{(F,w)i} = \text{Residuals} \quad (\text{centering each group})$$



Normality check

QQ-plot

Equal var check

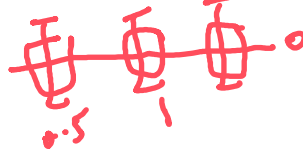
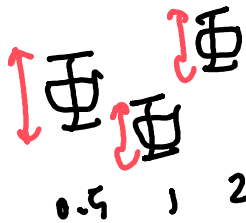
$H_0$ : Equal var

$H_a$ :  $\neq$

1-way  
2-way  
ANOVA

(1) Levene's test

(2) Residual plots



Post-hoc test

$H_0: \mu_{0.5} = \mu_1 = \mu_2$  (no Dose effect)

$H_a$ : at least one group has different mean

5

5.6

0.5

1

2

3 (2)

$H_0: \begin{cases} \mu_{0.5} = \mu_1 \\ \mu_{0.5} = \mu_2 \\ \mu_1 = \mu_2 \end{cases}$

$\mu_1 > \mu_{0.5}$

$\mu_2 > \mu_{0.5}$

$\mu_2 > \mu_1$

$\mu_2 > \mu_1 > \mu_{0.5}$

(reg) comparing two Anity

$H_0: \text{size}$

p-value

$\alpha$

$H_0: \begin{cases} \text{size} \\ \text{color} \\ \text{sweetness} \\ \text{weight} \end{cases}$

p-value

$\checkmark$  1 - 0.5  $\xrightarrow{p\text{-val}}$  0.1  
 $\checkmark$  2 - 0.5  $\xrightarrow{p\text{-val}}$  0.5  
 $\checkmark$  2 - 1  $\xrightarrow{p\text{-val}}$  0.001

$\rightarrow \begin{cases} \mu_1 = \mu_{0.5} \\ \mu_2 = \mu_{0.5} \end{cases}$   
 $\rightarrow \mu_2 > \mu_1$

## Two-way ANOVA (Balanced)

Full model

$$\text{Toothlength} \sim \text{Dose} + \text{treatment} + (\text{Dose} / \text{treatment})$$

$$\mu_{\text{Toothlength}} = \mu_0 + \mu_{\text{Dose}} + \mu_{\text{trt}} + \mu_{\text{Dose} \times \text{trt}}$$

$$SS_{\text{Total}} = SS_{\text{Model}} + SS_{\text{Error}}$$

$$= SS_{\text{Dose}} + SS_{\text{trt}} + SS_{\text{Dose} \times \text{trt}} + SS_{\text{Error}}$$

$SS_{\text{Model}} = SS_{\text{Dose}} + SS_{\text{trt}} + SS_{\text{Dose} \times \text{trt}}$

$SS_{\text{Error}}$  is random error.

(i) Dose effect  $[H_0: \mu_{0.5} = \mu_1 = \mu_2 \text{ vs. } H_a: \text{not } H_0]$

$$F\text{-stat} = \frac{SS_{\text{Dose}} / df(0)}{SS_{\text{Error}} / df(12)}$$

Small p-val.

sig Dose eff

(ii) Supplement effect  
 $[H_0: \mu_{0J} = \mu_{VC}]$  vs.  $H_a: \mu_{0J} \neq \mu_{VC}$

$$F\text{-stat} = \frac{SS_{\text{supp}} / df(\text{supp})}{SS_{\text{Error}} / df(\text{Error})}$$

sig. Supplement eff

(iii) Dose \* Supplement effect

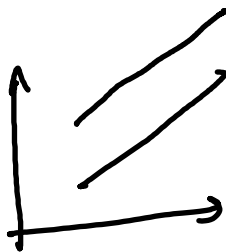
$H_0$ : no interaction vs.  $H_a$ : interaction

$$F\text{-stat} = \frac{SS_{\text{inter}}}{SS_{\text{Error}}}$$

sig. Interaction eff

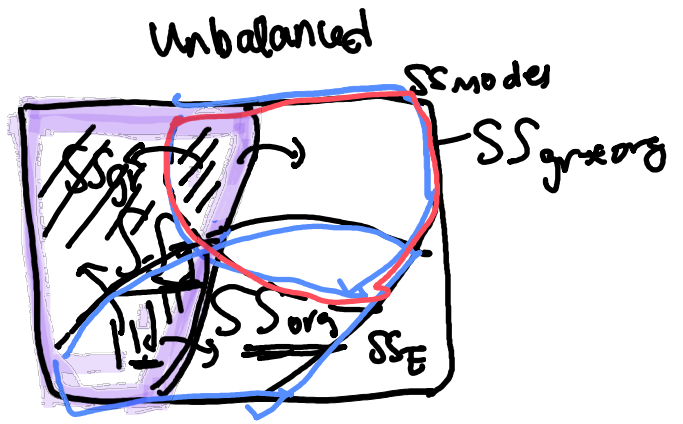
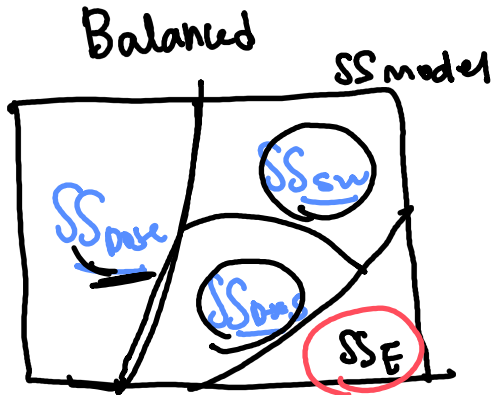
Dose  $\mu_1 > \mu_{0.5}$   
 $\mu_2 > \mu_{0.5}$   
 $\mu_2 > \mu_1$   $\rightarrow \mu_2 > \mu_1 > \mu_{0.5}$

Size  $\mu_{VC} < \mu_{0J}$



# Balanced / Unbalanced ANOVA

same goal



$$[\text{Toothlength} \sim \text{Dose} + \text{Supp} + \text{Dose} * \text{Supp}]$$

$$SS_{\text{Dose}} + SS_{\text{Supp}} + SS_{\text{Dose*Supp}}$$

SS\_model

$$[\text{days} \sim \text{gr} + \text{org} + \text{gr} * \text{org}]$$

$$SS_{\text{gr}} + SS_{\text{org}} + SS_{\text{gr*org}}$$

SS\_model



$$Y \sim \underline{A} + \underline{B} + \underline{C}$$

$$SS(C) = SS[C|A] = SS[C|B]$$

$$SS(C) = SS[C|AB]$$

SS\_T

$$SS(C) \neq SS[C|A] \neq SS[C|B] \neq SS[C|AB]$$

$H_0$ : no C effect

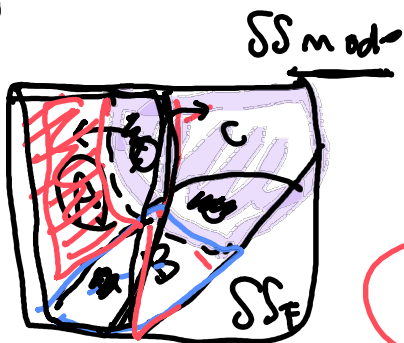
$H_{a1}$ : sig C eff

$$SS(C \cdot)$$

F-stat =

SS\_T

V.



$$Y \sim A + B + C$$

$$SS_{model} \neq SS(A) + SS(B) + SS(C)$$

$$\begin{aligned} SS_{model} &= SS(C) + SS(B|C) + SS(A|BC) \\ &= SS(A) + SS(B|A) + SS(C|AB) \\ &= SS(B) + SS(C|B) + SS(A|BC) \end{aligned}$$

$$Y \sim A + B + C$$

Type I "Sequential SS"

	DF	SS	MS	F	pval
A		SS(A)			
B		SS(B A)			
C		SS(C AB)			
		SS_model			

Type III "conditional SS"

	DF	SS	MS	F	pval
A		SS(A BC)			
B		SS(B AC)			
C		SS(C AB)			
		SS_model			

$$Y \sim C + A + B$$

	DF	SS	MS	F	pval
C		SS(C)			
A		SS(A C)			
B		SS(B AC)			
		SS_model			

	DF	SS	MS	F	pval
C		SS(C AB)			
A		SS(A BC)			
B		SS(B AC)			
		SS_model			

day ~

grade + origin

$$SS(\text{grade}) + SS(\text{origin} | \text{grade})$$

type I

$$\text{grade } SS(\text{grade}) \quad 2277$$

$$\text{origin } SS(\text{origin} | \text{grade}) \quad 2389$$

type II

$$SS(\text{grade} | \text{origin}) \quad 2020$$

$$SS(\text{origin} | \text{grade}) \quad 2389$$



grade effect

$$H_0: \mu_{F0} = \mu_{F1} = \mu_{F2} = \mu_{F3}$$

vs.

$H_{a1}$

origin effect

$$H_0: \mu_A = \mu_N$$

$$H_{a1}: \mu_A \neq \mu_N$$