

Week 4.

normality
 one-sample t-test
 two-sample t-test
 both groups ~ normal

ANOVA F-test

$$H_0: \mu = 50.000$$

$$H_a: \mu \neq 50.000$$

$$H_0: \mu_F = \mu_M$$

$$H_a: \mu_F \neq \mu_M$$

Equal var pool
 * s_p^2

$$H_0: \mu_F = \mu_M \text{ (gender)}$$

$$H_a: \mu_F \neq \mu_M$$

$$H_0: \mu_W = \mu_B = \mu_A \text{ (race)}$$

p-value
 no race effect

H_a : at least one race different

response
 (Y)

Salary
 Gender (F/M)
 Race (W/B/A)

sig race effect

parametric model

Balanced → Balanced ANOVA
 unbalanced → Unbalanced ANOVA

Equal var.
 $\mu(F.W)$ $\mu(M.A)$

ANOVA model formulation

$$Y_{(F.W)i} = \mu_{(F.W)} + \epsilon_i$$

$$Y_{(M.A)i} = \mu_{(M.A)} + \epsilon_i$$

random error

Decomposition of mean

Full model

2-way ANOVA w/ interaction

$$M_{(F,W)} = \underbrace{M_0}_{\text{baseline}} + \underbrace{M_F}_{\text{gender}} + \underbrace{M_W}_{\text{race}} + \underbrace{M_{F*W}}_{\text{interaction effect}}$$

$$M_{(M,A)} = M_0 + M_M + M_A + M_{M*A}$$

Interaction effect

cheese: 10g; cheese effect

Response (Y): How much eat (g)

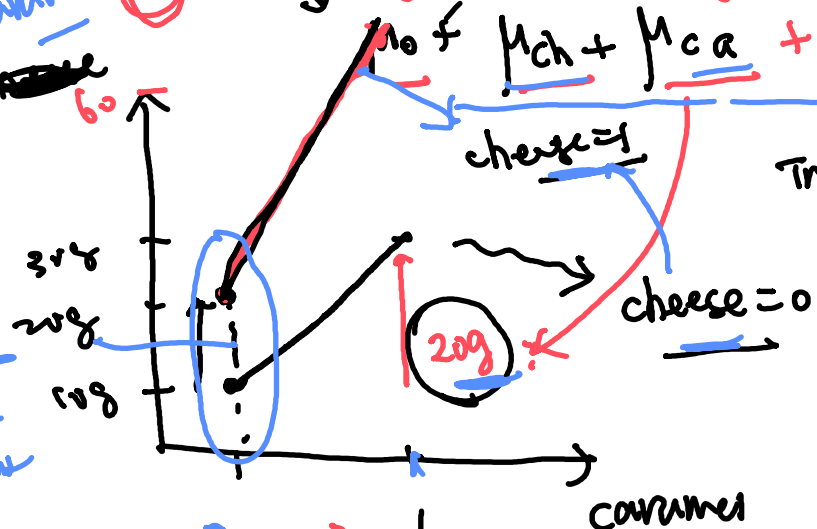
cheese (0) no cheese (1)
caramel (0) no caramel (1)

	0	1
caramel	0	1
	10g	20g
	30g	60g

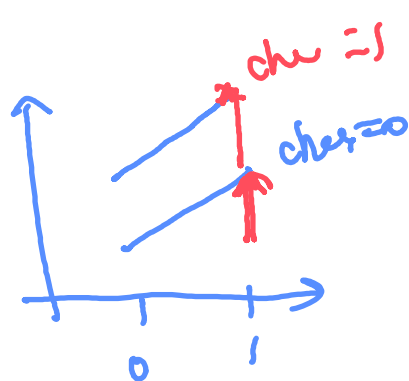
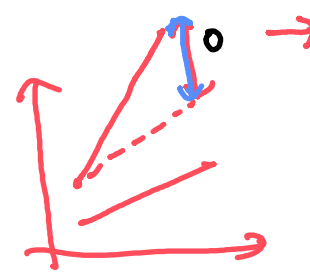
+20g
: caramel

cheese
60

10g
: cheese effect

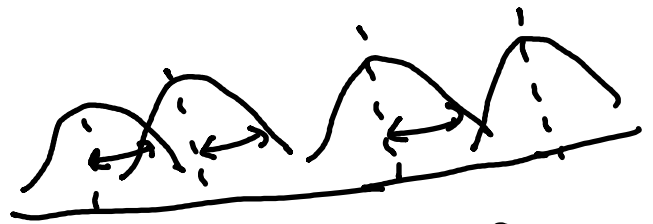


no + M_{ch} + M_{ca} + M_{ch*ca}
Interaction plot



Goal: identify significant effect on Y

$$\left\{ \begin{array}{l} \checkmark \text{ (main)} \\ \checkmark \text{ interaction} \end{array} \right\} \Rightarrow H_0, H_a$$



• ANOVA Assumptions

✓ 1) Y (response) is continuous

✓ 2) Normality of each group

✓ 3) Equal variance (Homoscedasticity)
Homogeneity...

✓ 4) iid sample

• How to check them?

→ manual check

→ diagnostic plot

ANOVA

diagnostic plot

1-way ANOVA: Levene's test

• Balanced Data

$$SS_{\text{Total}}$$

Variation of Y

Total variation of Y

$$SS_{\text{Model}}$$

btw group variation

variation of Y can be explained by model (race)

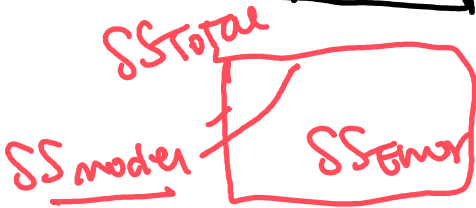
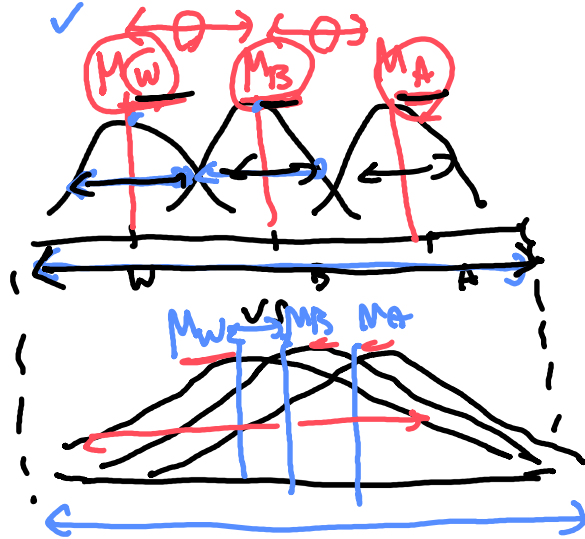
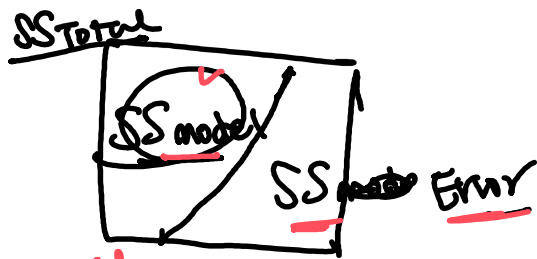
$$SS_{\text{Error}}$$

Within group variation

variation of Y can NOT be explained by model

systematic variation \Rightarrow random variation

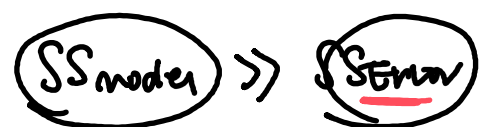
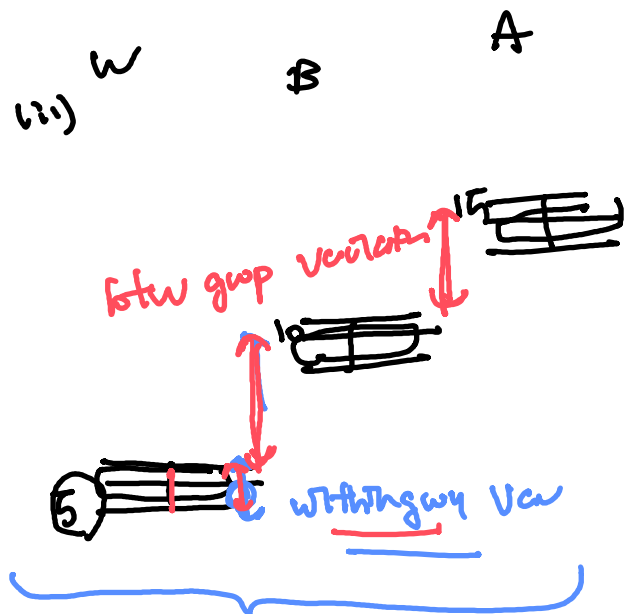
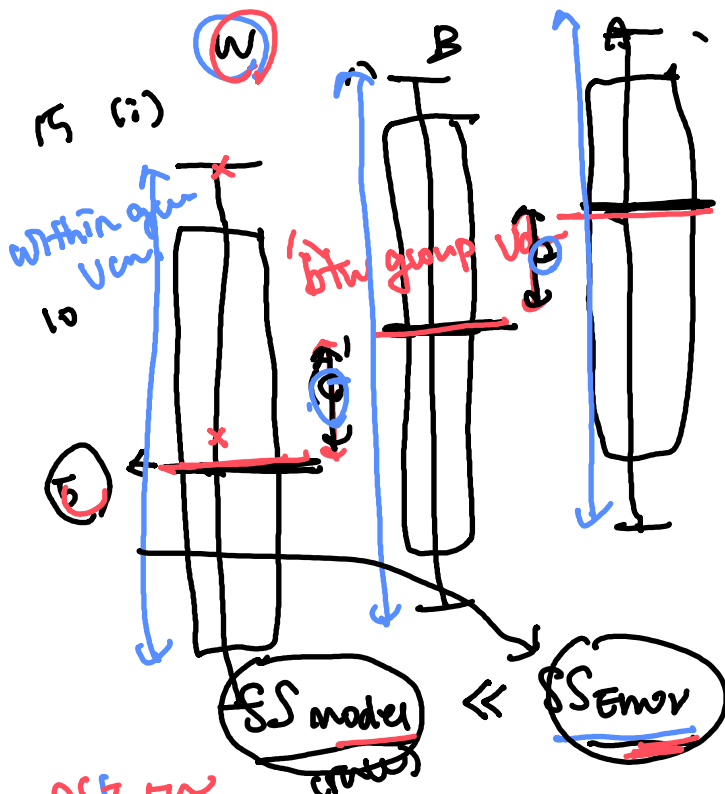
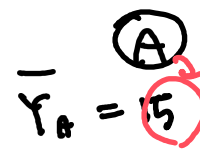
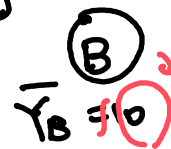
Salary ~ race



(eg) 1-way ANOVA

Salary ~ Rate (W/B/A)

$$\left\{ \begin{array}{l} H_0: \mu_W = \mu_B = \mu_A \text{ (no rate effect)} \\ H_a: \text{at least one} \dots \end{array} \right\}$$



F-test statistic

p-value

$F \approx 0 \rightarrow$ support H_0
 $F \text{ large} \rightarrow$ reject H_0

$$F = \frac{\text{btw group variation } (SS_{\text{model}}) / df_{\text{model}}}{\text{within group variation } (SS_{\text{Error}}) / df_{\text{Error}}}$$

p-value

$$\alpha = 0.05$$

Among i), ii), which data lead larger F?
 Smaller F?

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

$R^2 = \frac{SS_{\text{model}}}{SS_{\text{Total}}} \leq 1$

$R^2 = 5\%$
 $R^2 = 70\%$
 $R^2 = 99\%$

$n = 50$

Data example.

Two-way

Toothlength \sim Dose (0.5) (1) (2)

(a) Balanced?

Note: Balun Unbal

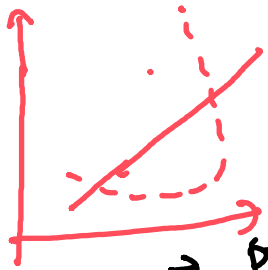
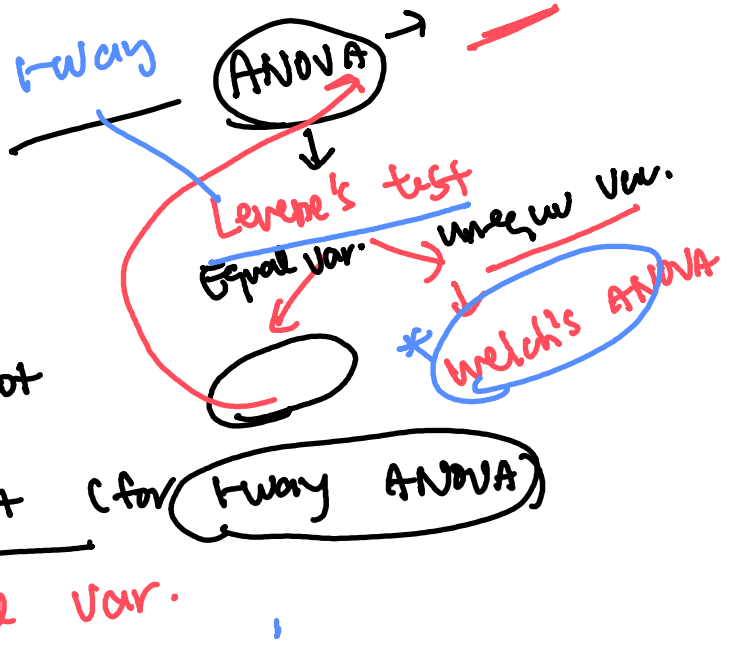
(i) Test significant effect of Dose

$H_0: \mu_{0.5} = \mu_1 = \mu_2$
 H_{a1} : at least

(2) R^2

(3) Model diagnostics

- diagnostics plot
- Levene's test (for Two-way ANOVA)



$p\text{-val}: 0.0001 \rightarrow$ Unequal Var.

