

DAV-3

HYPOTHESIS TESTING

(Class starts
@ 9:05 PM)



Lecture 6: ANOVA

≡

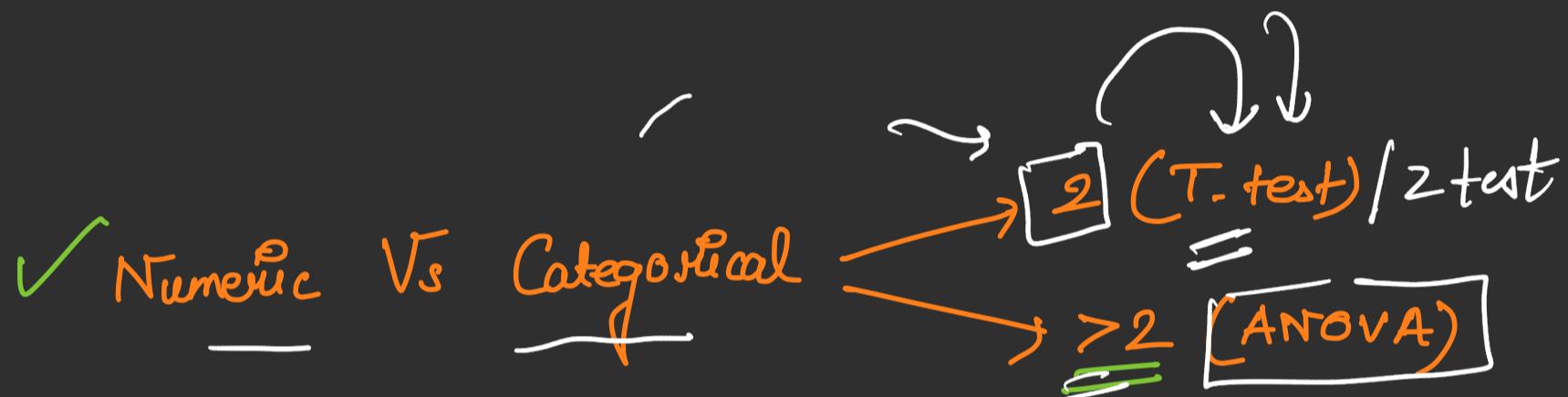
class starts at 9:05 Pty

Agenda

- ① One way ANOVA ✓
- ② KW-Test (Kruskal-Wallis Test)
- ③ Test for Normality
 - QQ plot ✓
 - SW Test ✓
- ④ Levene's Test ✓

Types of Test

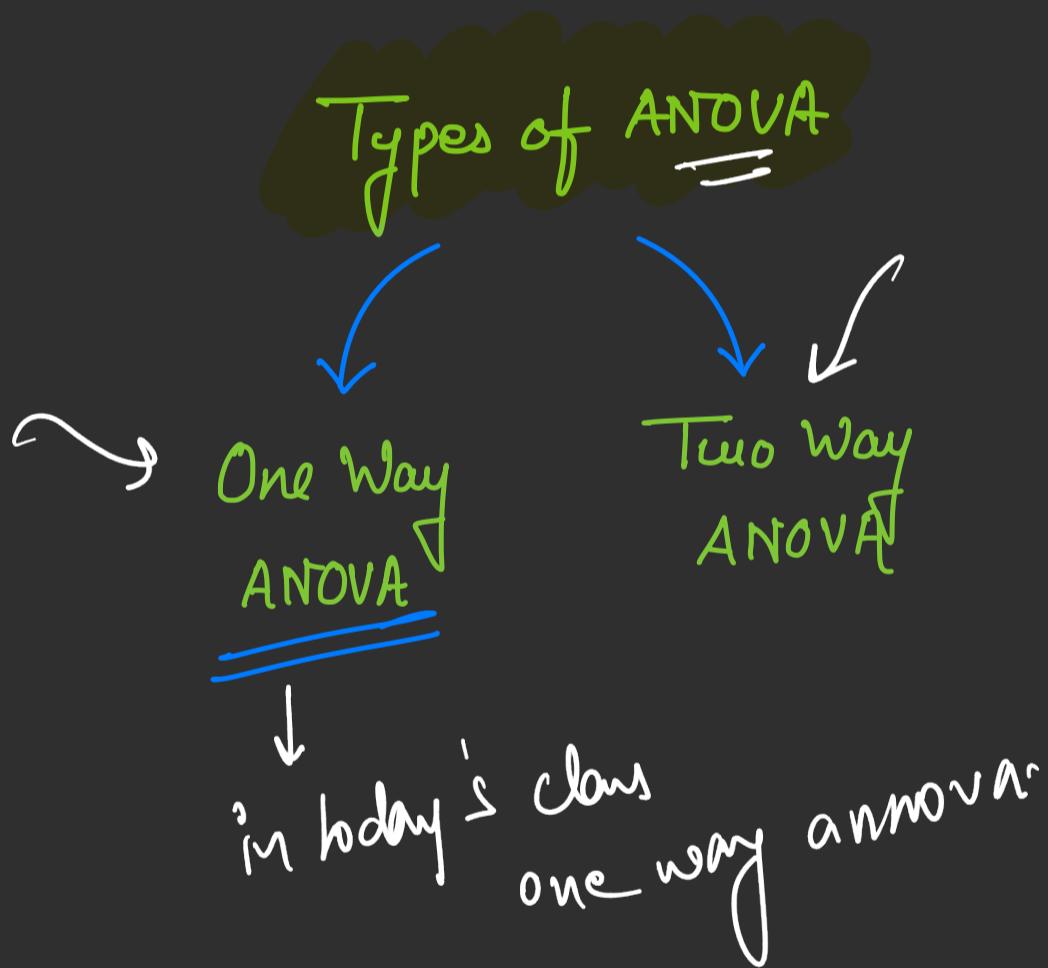
~~so far~~



Categorical Vs Categorical → Chi square test

Numeric Vs Numeric → Correlation
in 2 days.

ANOVA
→ (Analysis of Variance)



Aerofit Example

"C" "N"
"Product" Vs "Income"

i) KP 781
ii) KP 481
=

→ KP781 - (i)
KP481 - (ii) → Answer
KP281 - (iii)

why can't we
use t-test?

Boxplot
5 pt summary

Issues wrt T-Test (Motivation for ANOVA)

~~1~~ Too Many Tests

3 categories $\rightarrow 3 \text{ Tests}$

n categories $\rightarrow nC_2$

$n = 3$

$$3C_2 = \frac{3 \times 2}{2 \times 1} = 3$$

$$10C_2 = \frac{10 \times 9}{2 \times 1} = 45$$

$$100 \rightarrow \underbrace{5\% \times 5\% \dots 5\%}_{\text{More Tests}} \rightarrow 45$$

~~2~~ Error Compounds

$\alpha \rightarrow \text{Margin of Error}$

(5%)

More Test \rightarrow "more chances of Margin of Error"

$\{T_1, T_2, T_3\}$

$$nC_2 \Rightarrow {}^3C_2 = \frac{3 \times 2!}{2!} = \underline{\underline{3 \text{ Tests}}}$$

$\checkmark T_1 \text{ vs } T_2$
 $\checkmark T_1 \text{ vs } T_3$
 $\checkmark T_2 \text{ vs } T_1$
 $\checkmark T_2 \text{ vs } T_3$
 $\checkmark T_3 \text{ vs } T_1$
 $\checkmark T_3 \text{ vs } T_2$

permutation \Rightarrow comb \Rightarrow

$\{T_1 \text{ vs } T_2, T_2 \text{ vs } T_3, T_3 \text{ vs } T_1\}$

$\overset{2}{\checkmark} T_1 \text{ and } \overset{2}{\checkmark} T_2$
 KPFBI KPFBI

2) Error rate compounds:

what is margin of error that we consider?

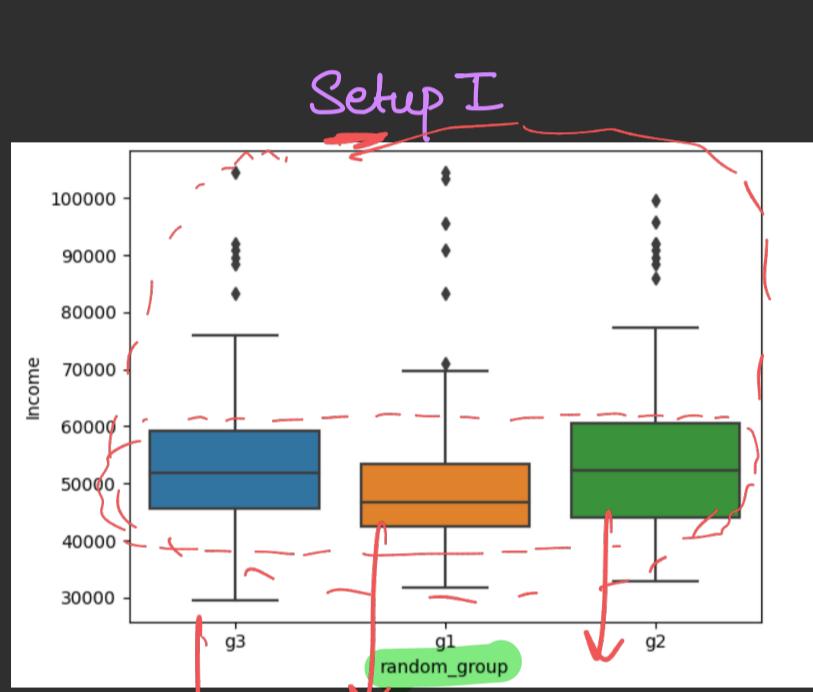
$\alpha = 5\% \rightarrow$ this amount of errors business
can handle

If I am doing 100 tests what will be MoE?

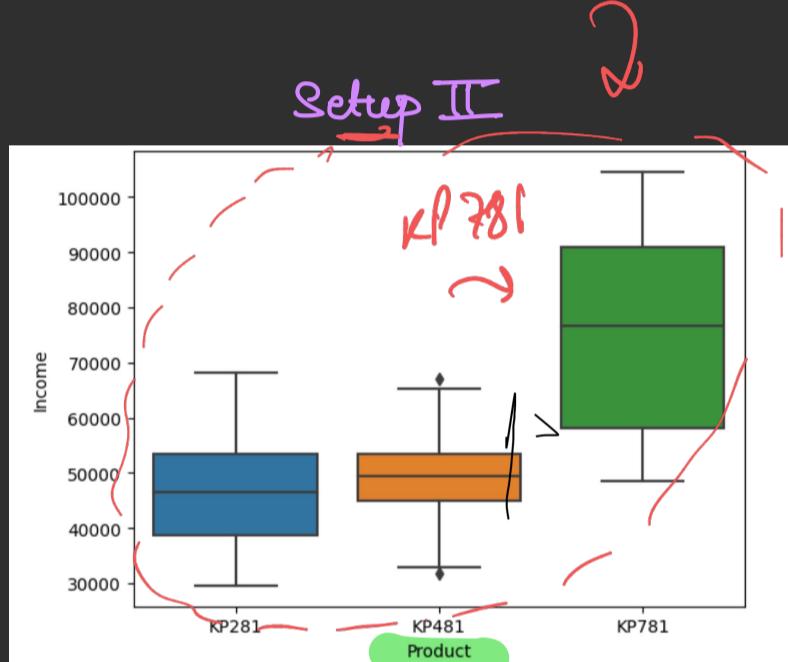
100 \rightarrow 5% \times 5% \times 5% - - - 100

Aerofit Example

(Which setup has a higher variance?)



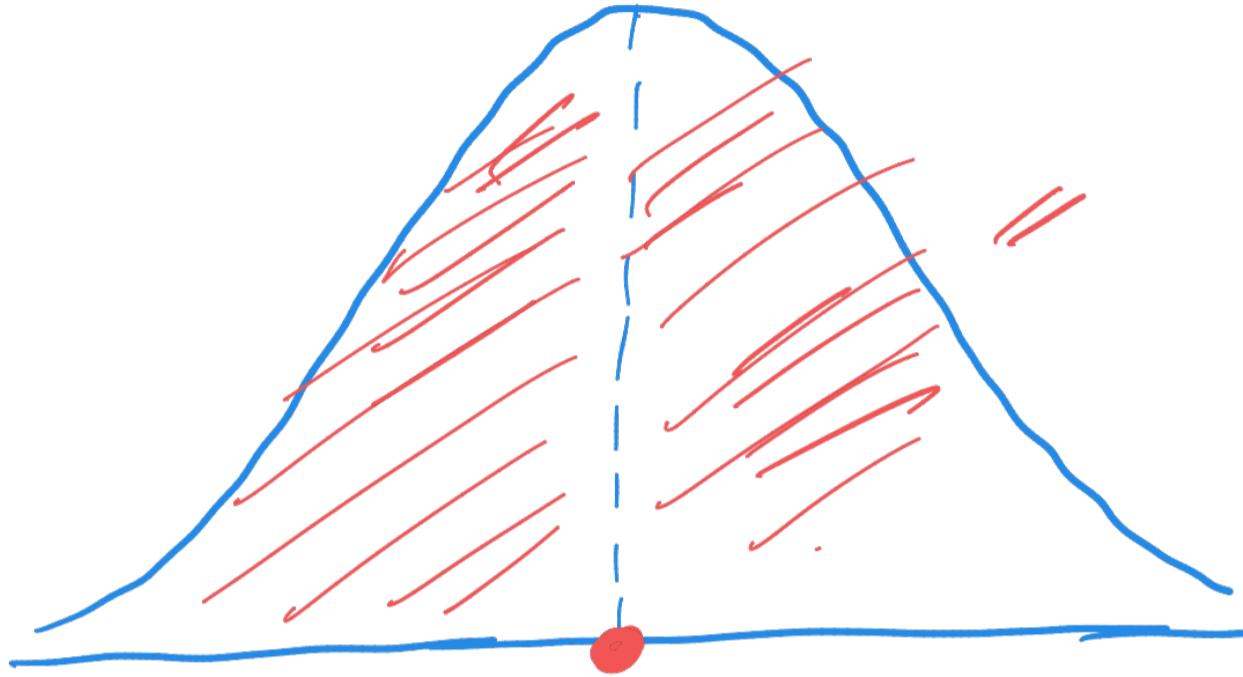
I ↓ II ↑ III
setup I



Setup 2 

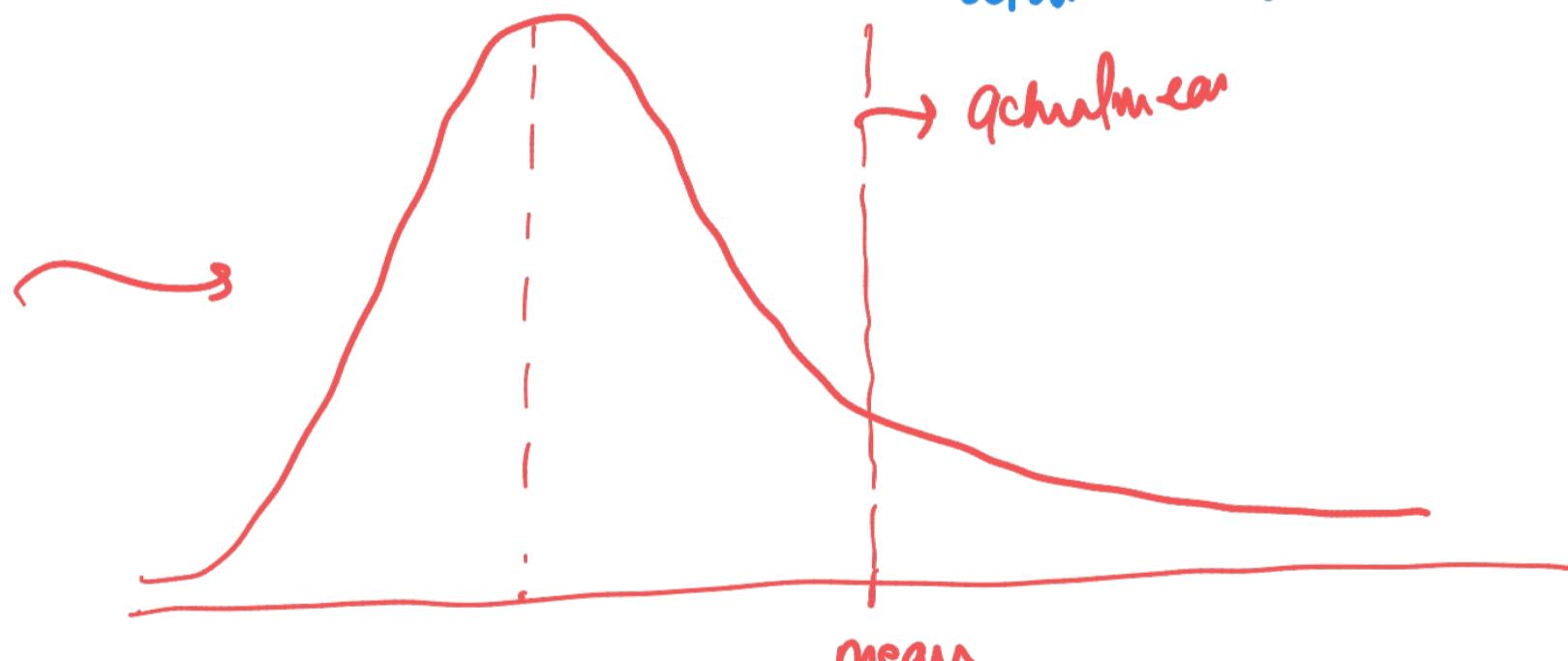
H₀ :- mean of all 3 groups are same

H_a :- mean of all 3 groups are not same



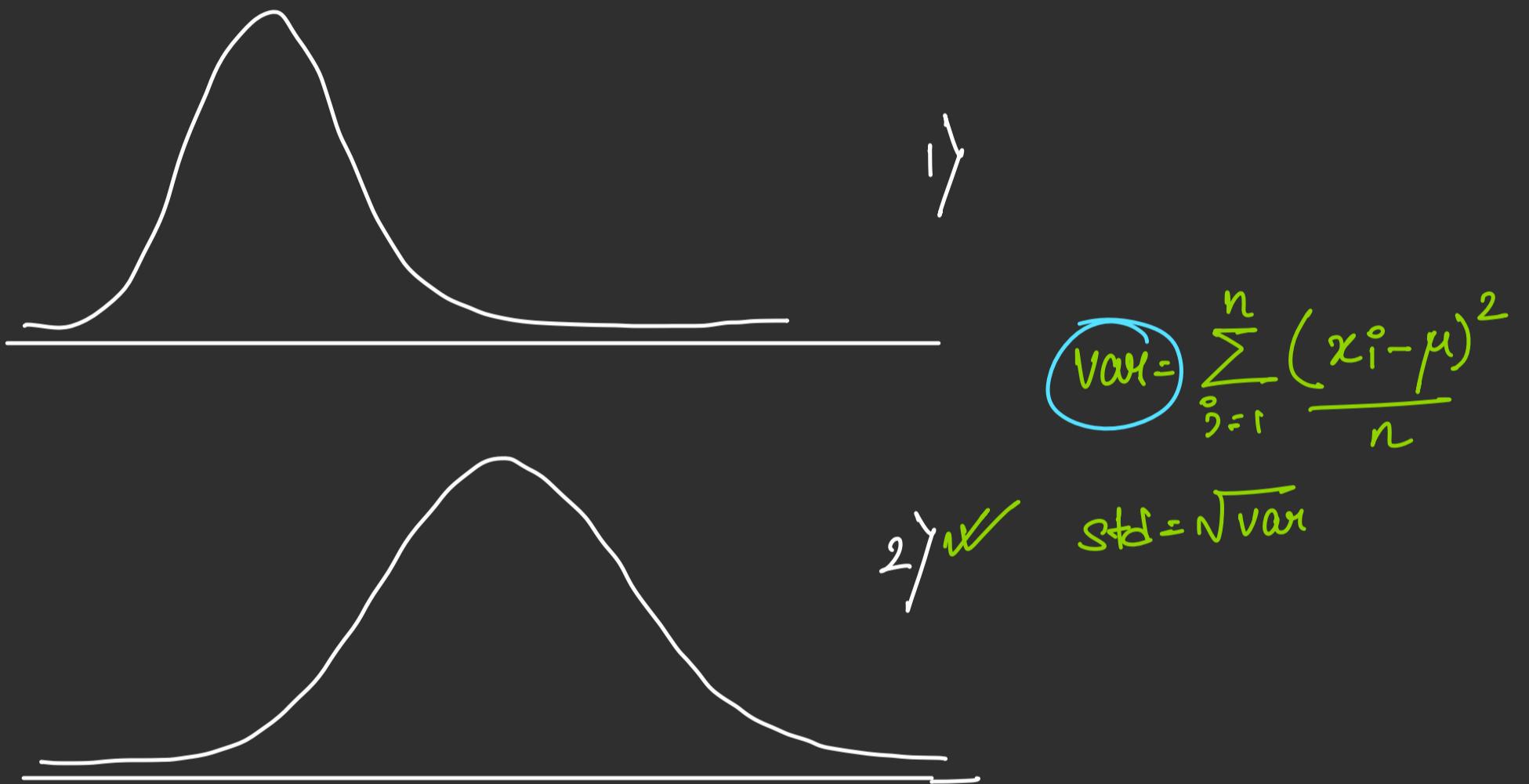
mean = median = mode

$$\frac{(x_i - \mu)^2}{N}$$



mean

less variance here as compared to the normal distribution



H_0 : means of all 3 groups are same
 H_a : means of all 3 groups are not same / or atleast one of the groups is different

→ $H_a: \left[\begin{array}{l} \overline{q_1} = \overline{q_2} \neq \overline{q_3} \\ \overline{q_1} \neq \overline{q_2} = \overline{q_3} \\ \overline{q_1} = \overline{q_3} \neq \overline{q_2} \end{array} \right] \quad \downarrow$

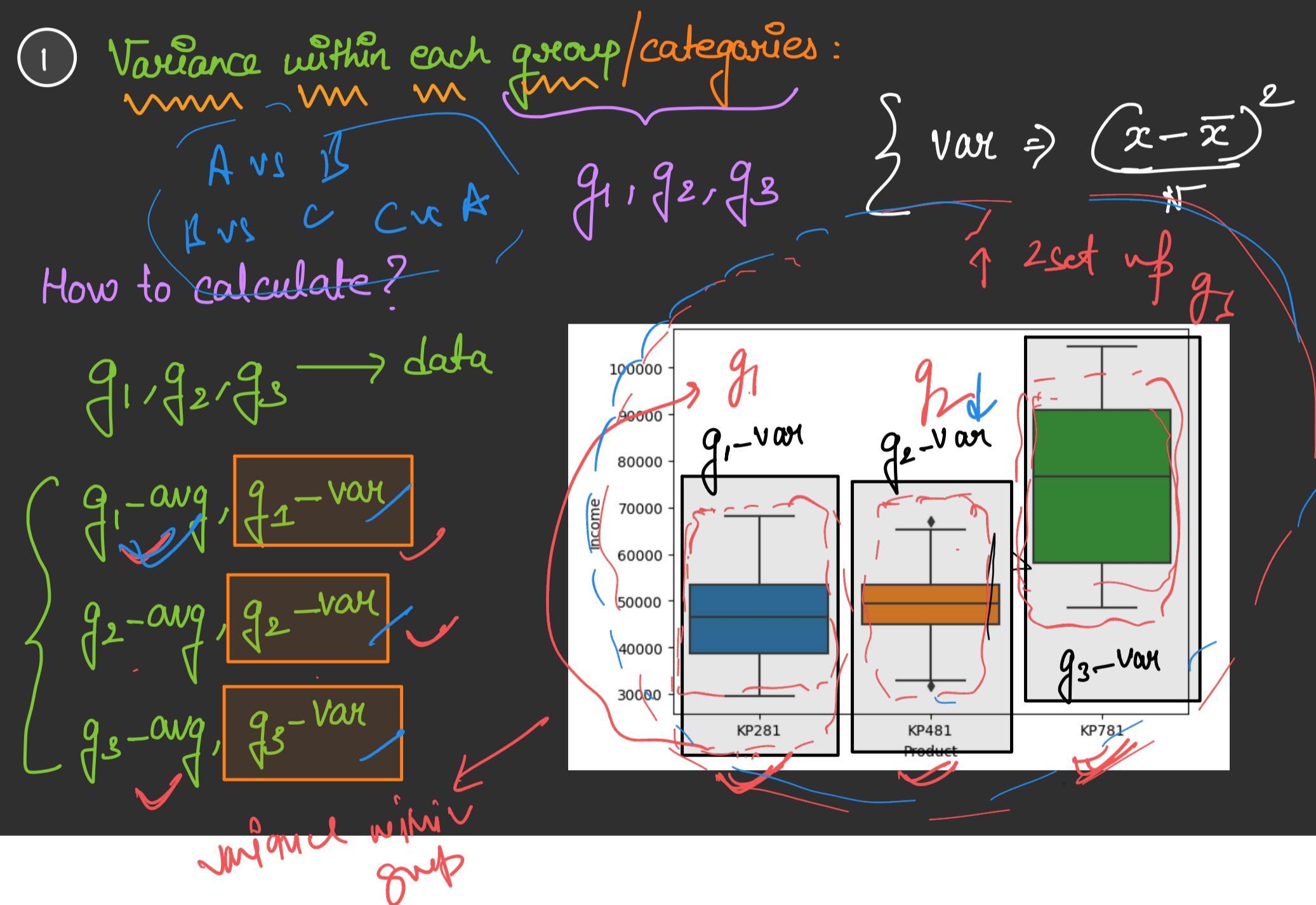
ANOVA
Analysis of variance

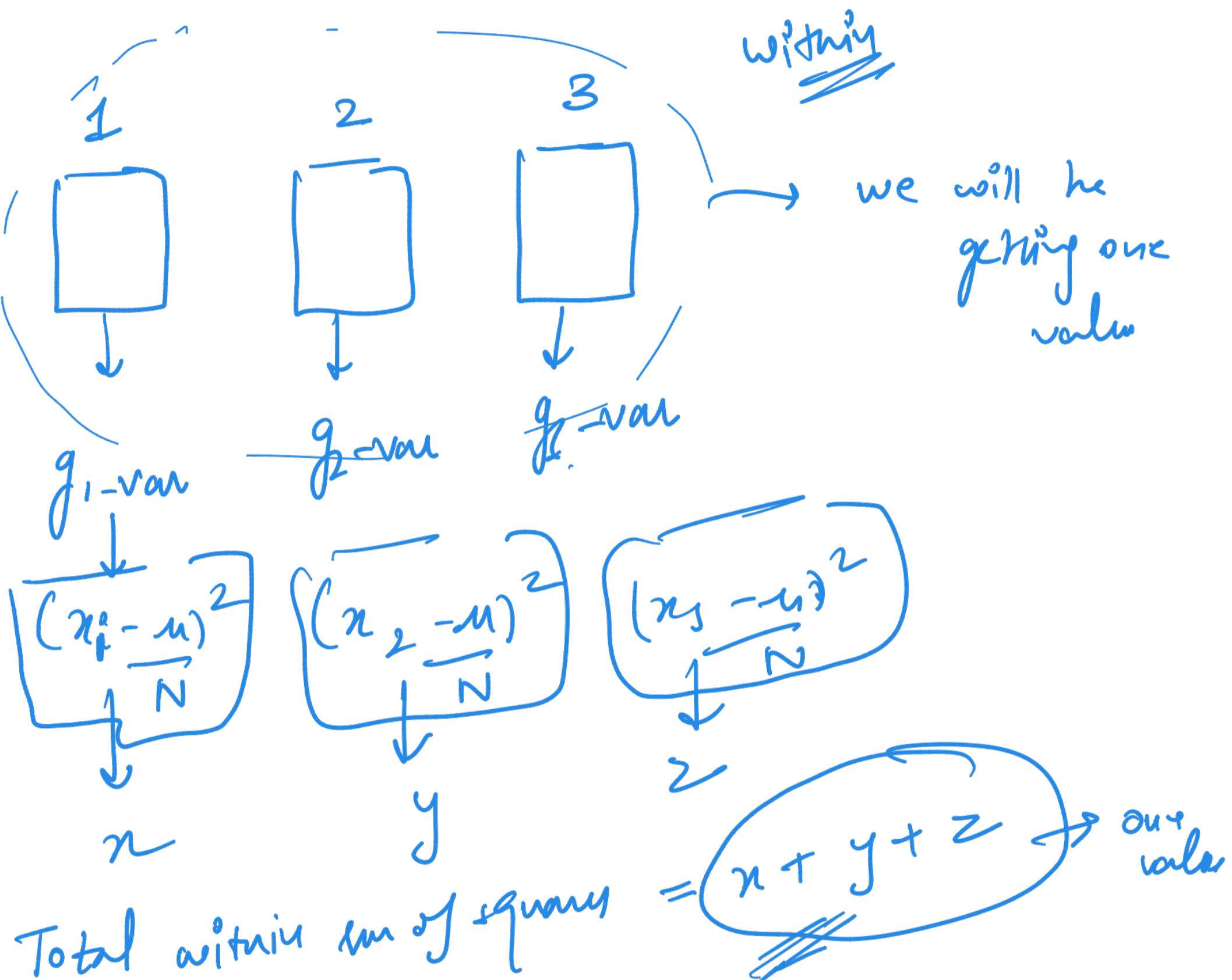
$$H_0: \bar{g}_1 = \bar{g}_2 = \bar{g}_3$$

$\checkmark H_a: \text{group means are not same}$

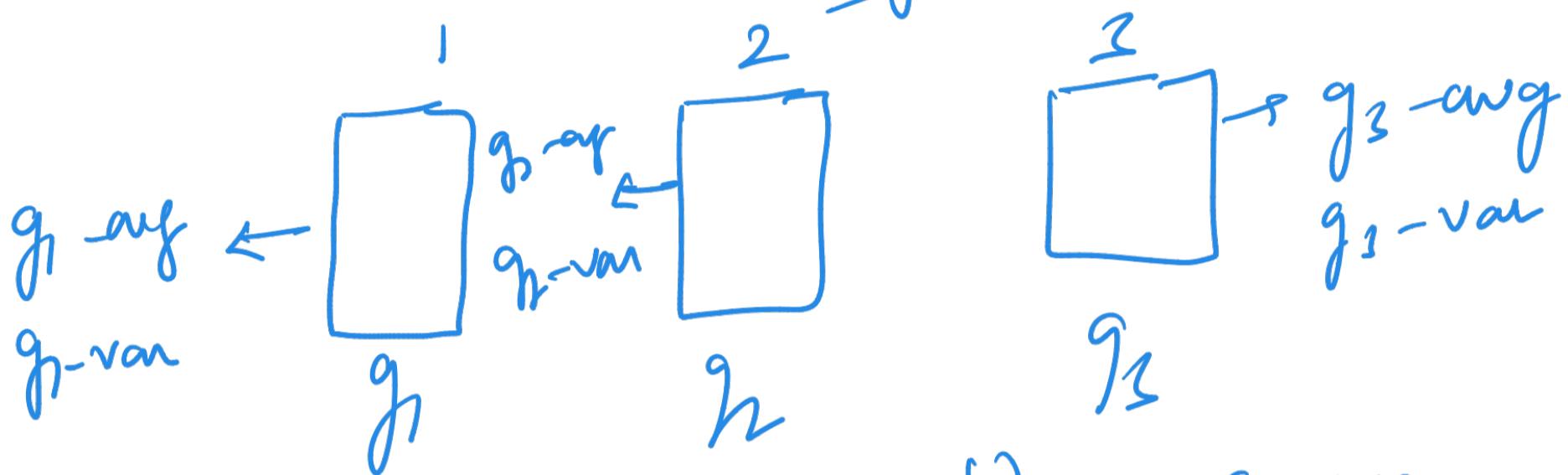
$$\begin{array}{l} H_0: \\ H_a: \end{array} \left. \begin{array}{c} \checkmark \\ \text{Means} \end{array} \right\}$$

New Terminologies





Between groups



$$g_1 \ g_2 \ g_3 \cdot \text{mean}() \Rightarrow g\text{-avg}$$

$$\begin{aligned} g\text{-var} = & (g_1\text{avg} - g\text{avg})^2 + (g_2\text{avg} - g\text{avg})^2 \\ & + (g_3\text{avg} - g\text{avg})^2 \end{aligned}$$

3.

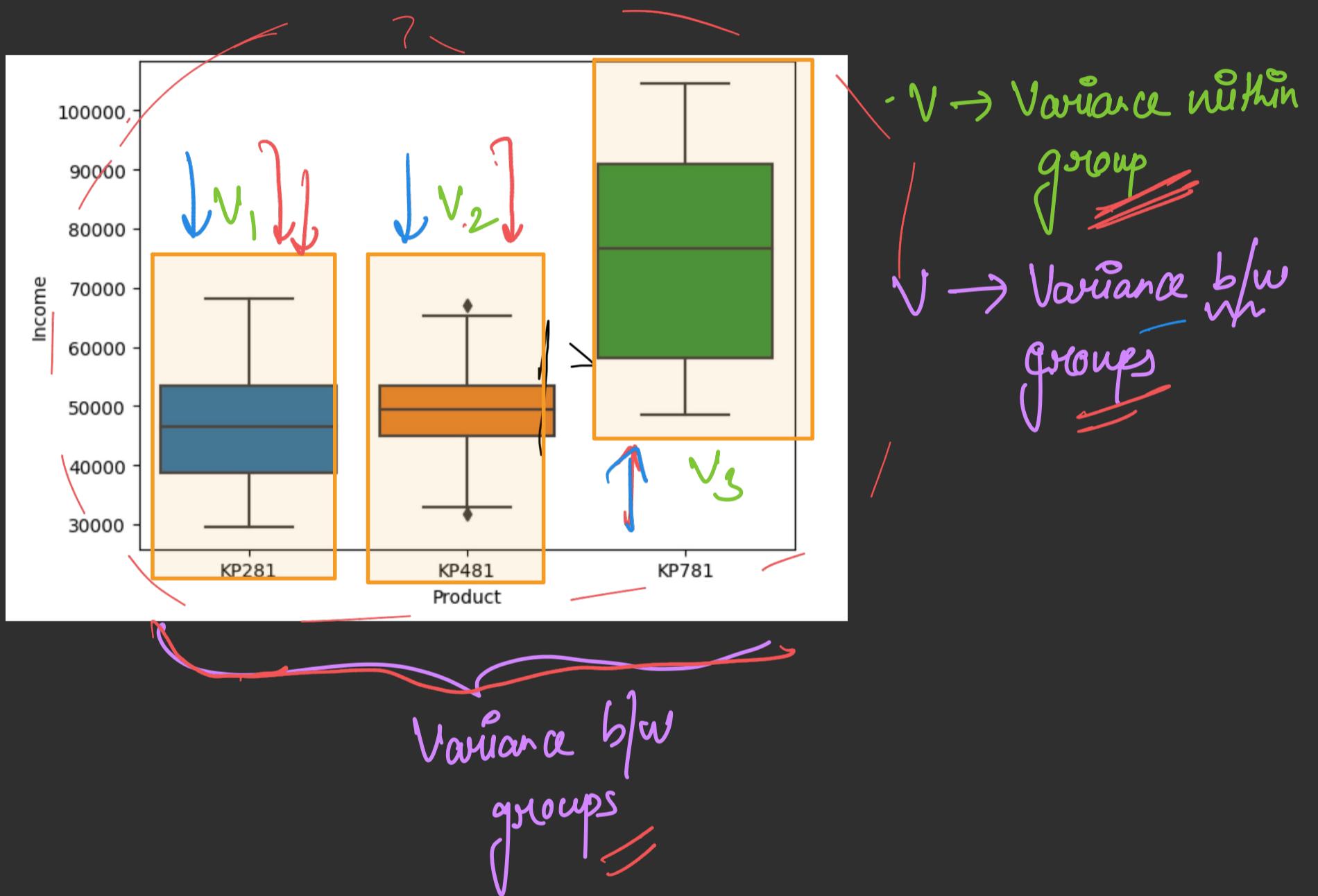
② Variance between groups:

How to calculate?

$$\begin{aligned}
 & \text{global-avg} \rightarrow \bar{g}_1, \bar{g}_2, \bar{g}_3 \\
 & \text{global-var} \Rightarrow \frac{(g_{1\text{avg}} - \bar{g}_{\text{avg}})^2 + (g_{2\text{avg}} - \bar{g}_{\text{avg}})^2 + (g_{3\text{avg}} - \bar{g}_{\text{avg}})^2 + (g_4 - \bar{g}_{\text{avg}})^2}{N-8}
 \end{aligned}$$

Here $N \rightarrow 3$ (3 categories/group)

$\boxed{\bar{g}_1, \bar{g}_2, \bar{g}_3} \cdot \underline{\text{mean}}$



Test Statistics

$$F \text{ ratio} = \frac{\text{Variance b/w groups}}{\text{Variance within group}}$$

↓ ↓ ↓ ↓

F statistic

F ratio = $\frac{B}{W}$

$$F \text{ ratio} = \frac{\frac{(x_i - \bar{x})^2}{N}}{\frac{(x_j - \bar{x}_j)^2}{N}} = \frac{\frac{(O - E)^2}{E}}{\frac{(O - E')^2}{E'}}$$

$F \text{ ratio} \uparrow \rightarrow \text{low pvalue} \rightarrow \text{Reject } H_0$

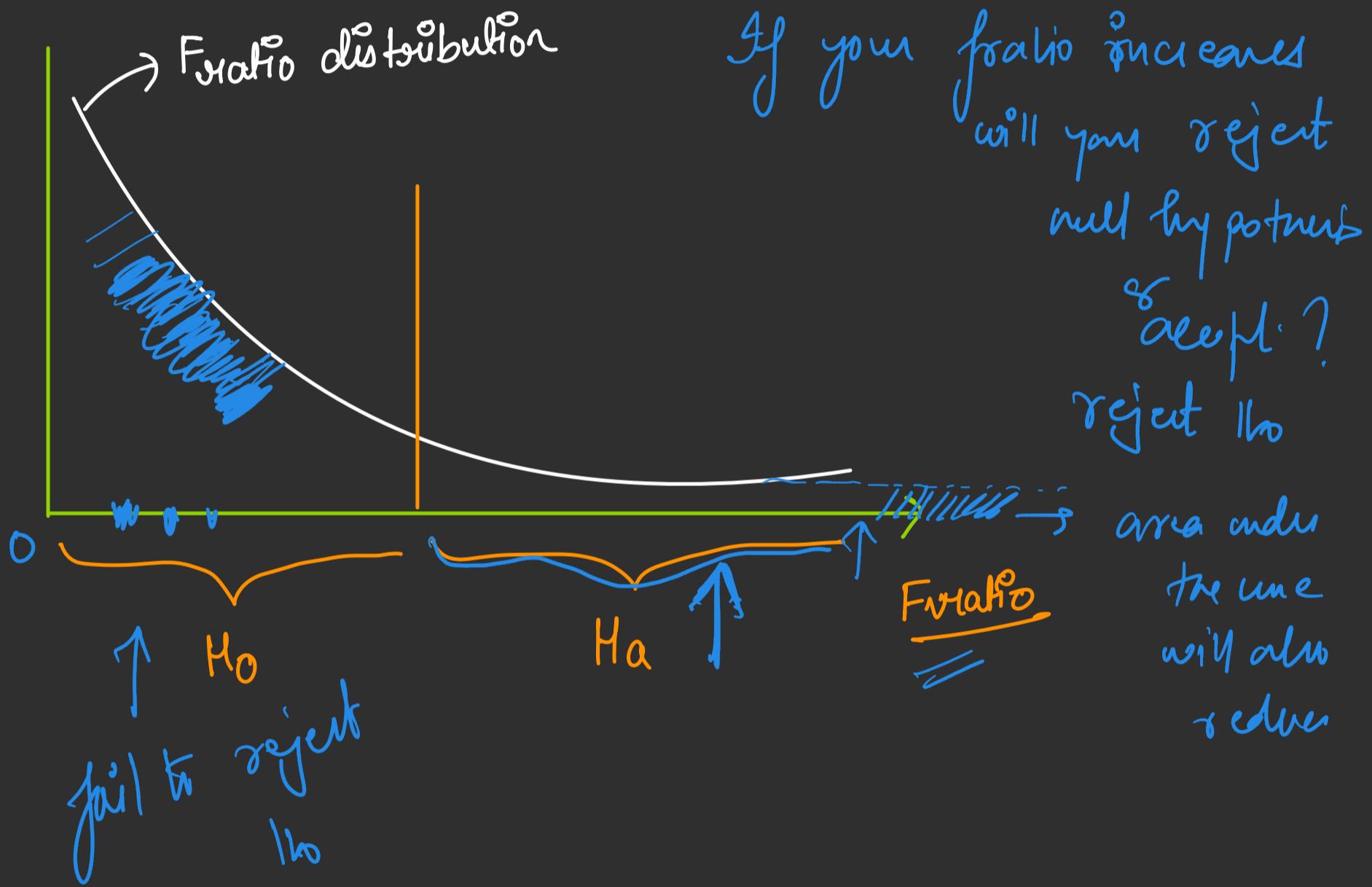
$$\left\{ \begin{array}{l} \text{if } F \text{ ratio} \uparrow \propto \text{ Variance b/w group} \uparrow \\ \text{if } F \text{ ratio} \uparrow \propto \frac{1}{\text{ Variance within group}} \downarrow \end{array} \right.$$

$$F_{ratio} = \frac{\text{Var b/w groups}}{\text{Var within groups}} = \frac{\frac{(x-\mu)^2}{N}}{\frac{(x-\mu)^2}{N}}$$

dof₁ = w
dof₂ = v

$\chi^2 \rightarrow$ Always pos

$$\chi^2 = \frac{(O - E)^2}{E}$$



#Quiz

$$F \text{ ratio} = \frac{\text{Variance b/w groups } \checkmark}{\text{Variance within group } \checkmark}$$

F statistic
(Test Statistic)

H_0 : means are same b/w groups (There is no significant diff b/w groups)

H_a : ~~opp~~

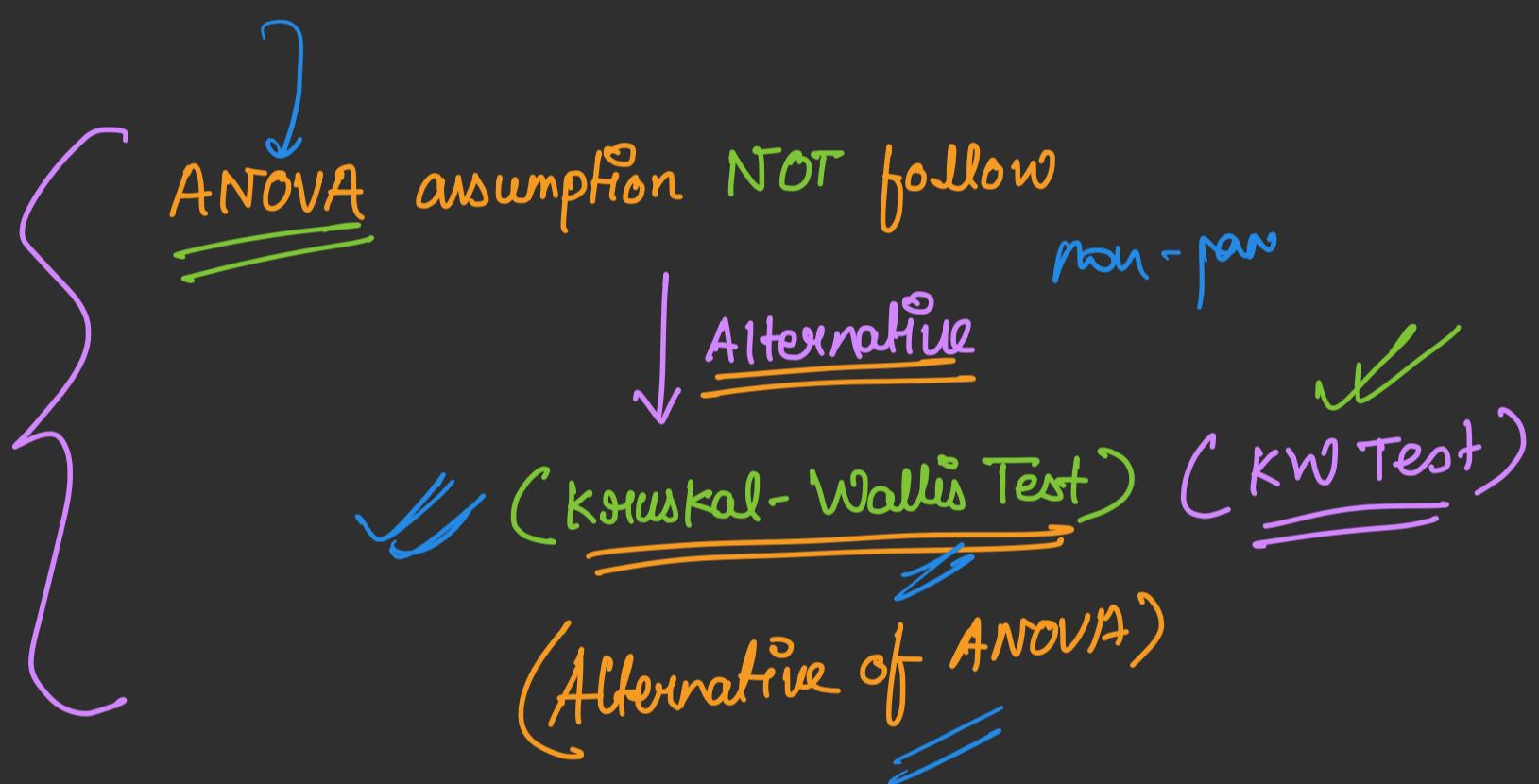
$$\checkmark F\text{-ratio} \Rightarrow \frac{\checkmark \text{Var b/w groups}}{\text{Var within groups}}$$

$$\chi^2 = \sum \frac{(O - E)^2}{E}$$

$$\frac{\checkmark \text{Chi}^2 \text{ statistic } (df = v_1)}{\text{Chi}^2 \text{ statistic } (df = v_2)}$$

Assumptions of ANOVA

- ① Data should be Normal / Gaussian (Income Example) (Normality Test)
- ② Data is independent of each other (Income of one person is not dependent on each other)
- ③ Equal variance in different group → QQ plot
Leven's Test Equal sample size



Kruskal - Wallis Test

Test to compare the median of two or more independent groups.

↪ Alternative to one-way ANOVA (useful when data is non-linear)
Normality

H_0 : Population of all groups have same median

H_a : At least one of the group has different median

Non parametric Test → Does not care what the underlying dist of data

Advantages of KW Test

- ① No assumption of normality ~~not~~ X
- ② Robust to outliers ~~not~~ ?

anova also does not tell that

Limitations of KW Test

- ① Doesn't really tell you which group is different (Also same for ANOVA)
- ② Less powerful than ANOVA.

parametric Test

Z-test

T-test

ANOVA

Non-parametric

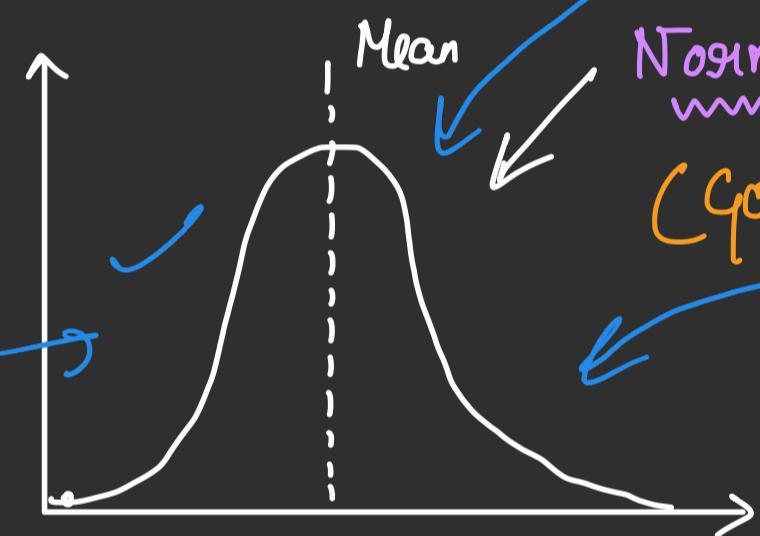
KW Test

~~#~~ Normality Test

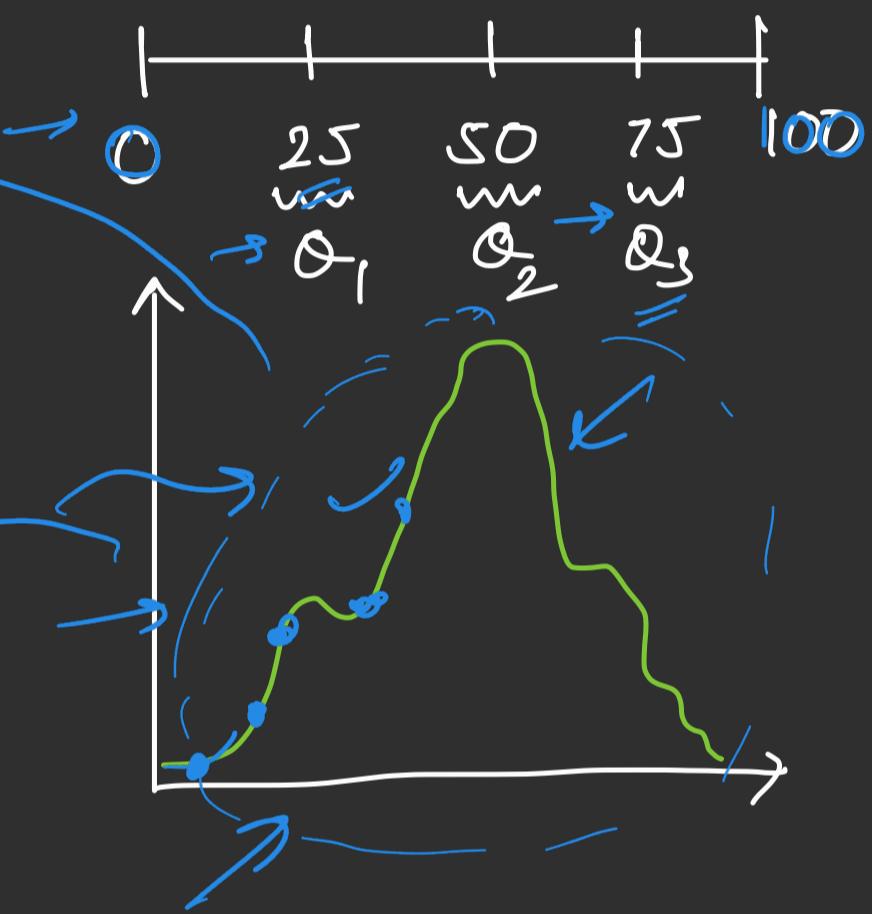
- ① QQ plot [Visual Approach]
- ② Shapiro-Wilk Test [HT approach]

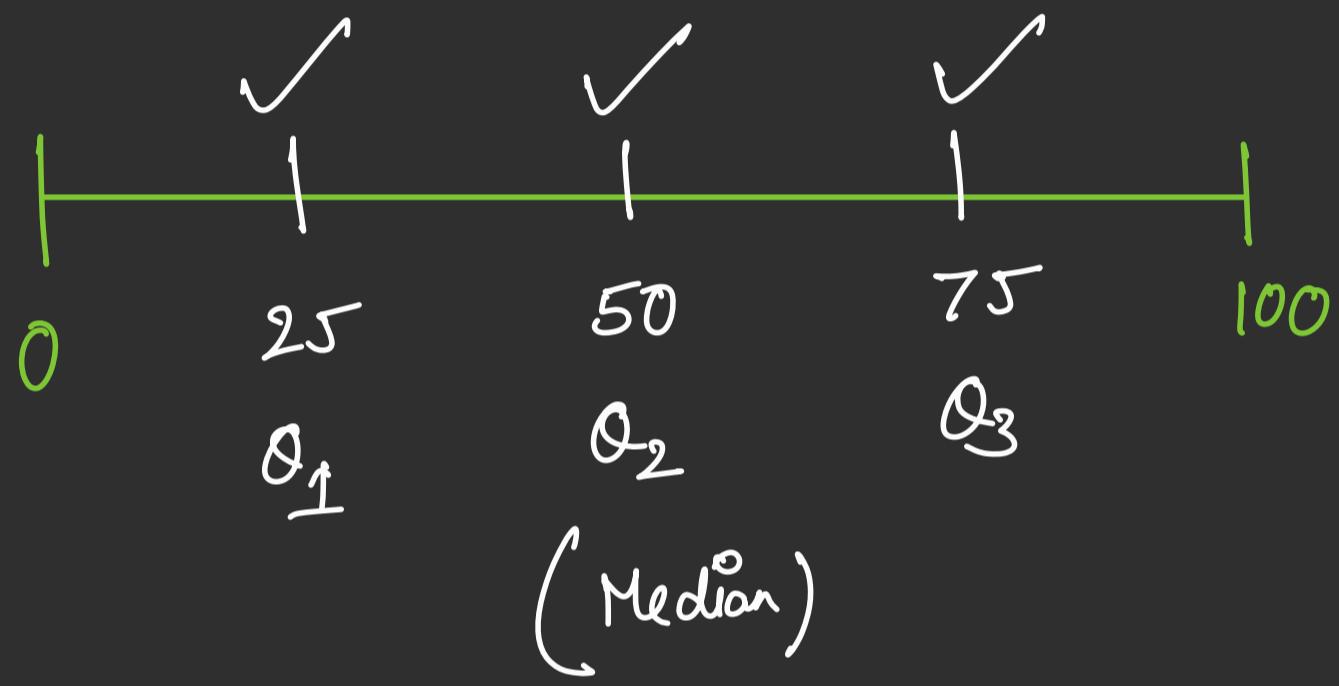
QQ plot (Visual Representation)

↳ Quantile

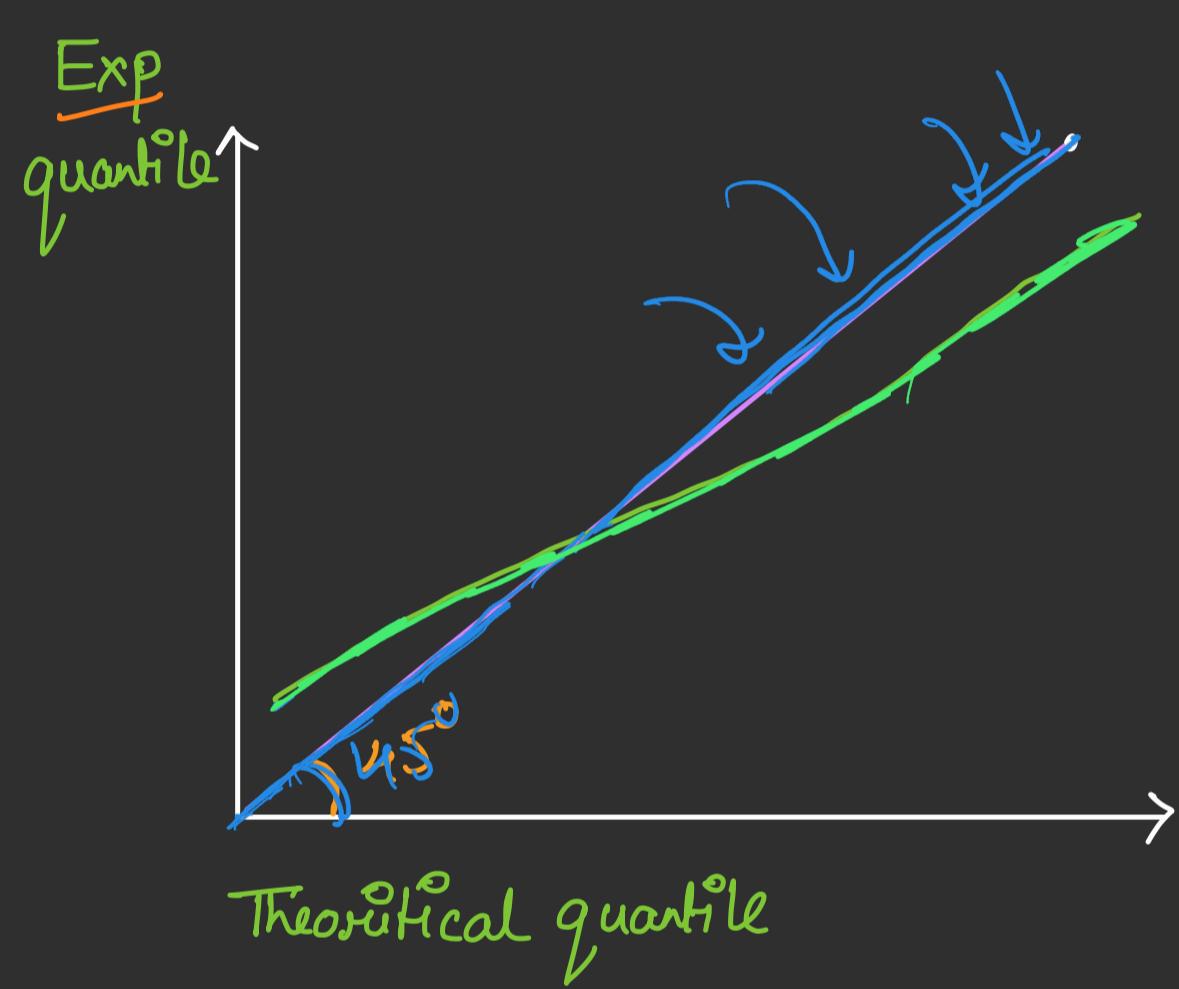


Normal dist
(Golden dist)

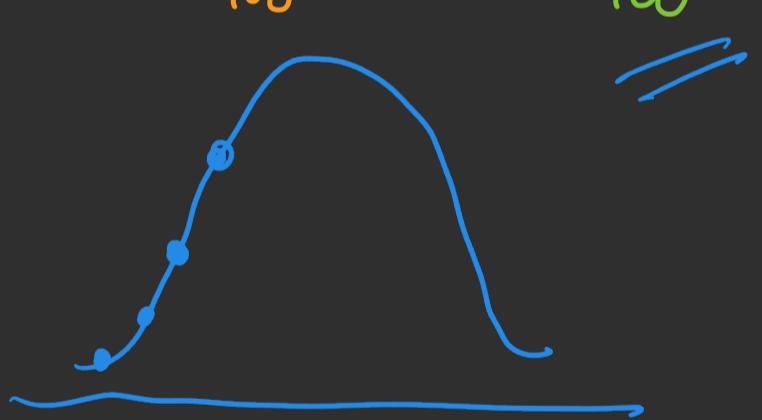


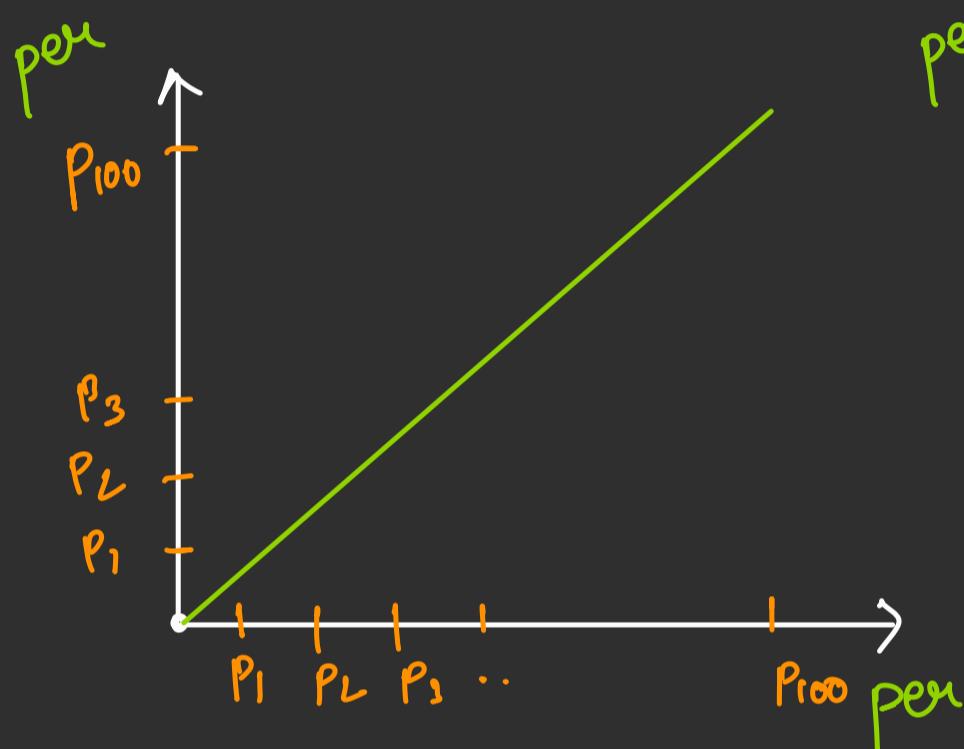


normal dist

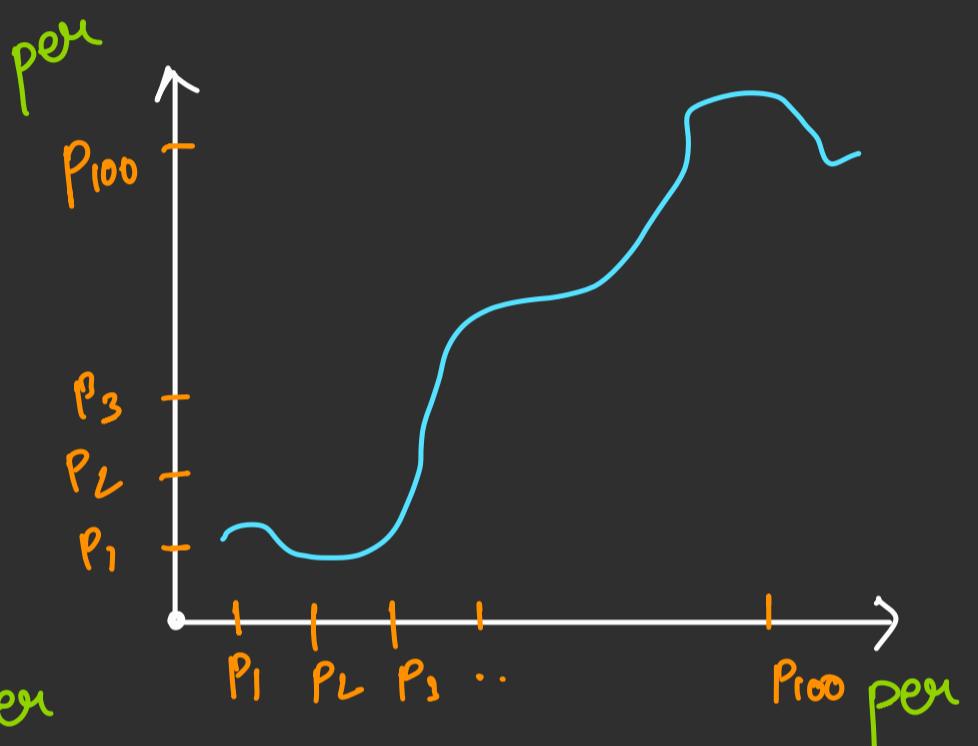


Theoretical	Exp
$P_1 \rightarrow$	P_1
$P_2 \rightarrow$	P_2
$P_3 \rightarrow$	\vdots
P_4	\vdots
\vdots	\vdots
P_{100}	P_{100}





Empirical Dist
(Normal)



Your dist

Shapiro-Wilk Test (Statistical Test)

$\begin{cases} H_0: \text{Data is Gaussian} \\ H_a: \text{Data is not Gaussian} \end{cases}$

$$\underline{\alpha = 5\%}$$

if p value < α :

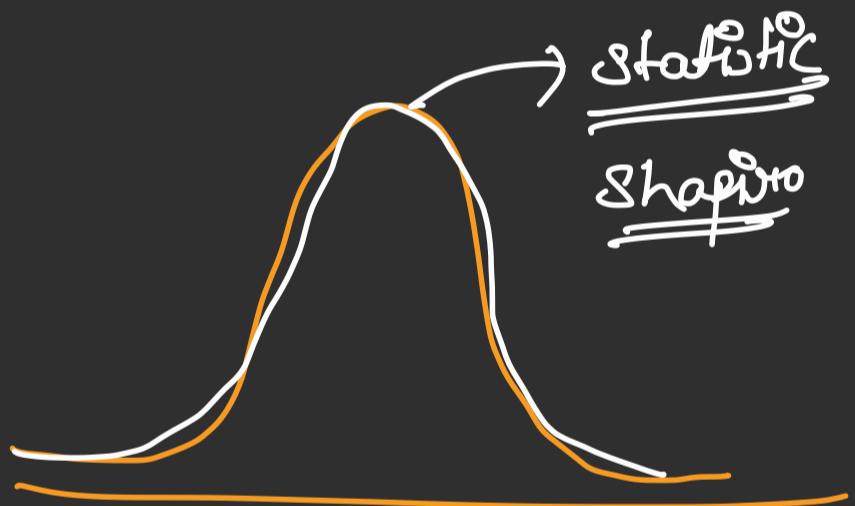
Reject H_0

else:

Fail to Reject H_0

~~✓~~ Note:

This test may not work well
when data is too large]



Levene's Test (Aka Test of Variability)

Assumption of ANOVA: "There should be equal variance in diff groups/categories in our data".

$$F\text{ ratio} = \frac{\text{Var across group}}{\text{Var within group}}$$