



## Analysis of Variance (ANOVA) :

→ Why we need ANOVA?

Ans ANOVA is used to compare the statistical significance b/w the means of three or more independent groups or samples. Because, when no. of samples are more than two then it is very difficult and time consuming to apply t-test.

### Basic Terms:

- (1) Experimental unit :→ The object on which a measurement is taken.
- (2) Factor :→ A factor is an independent variable whose values are controlled and varied by the experimenter.
- (3) Level :→ Level is an intensity setting of a factor.
- (4) Treatment :→ A specific combination of factor ~~at~~ levels.

Ex A group of people is divided into two groups. one group has given the aptitude test after having breakfast while another group has given the same test without eating breakfast. What are the factors, levels and treatments in this experiment?

Sol<sup>n</sup> :→ Experiment unit - People

factors - meal

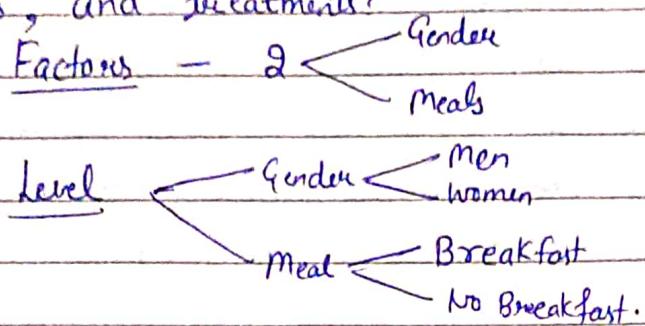
levels      ↙ Breakfast  
                  No Breakfast

Treatments

Meal	
B Breakfast	No Breakfast
-	-
-	-

Ex:- In previous Example, If group of people is like 20 men and 20 women form the Experiment. Then what are the factors, levels, and treatments?

Soln



Factors		Meal		(Four Treatments)
		Without Breakfast	With Breakfast	
Gender	Men	—	—	
	Women	—	—	

ANOVA — No. of Samples  $> 2$ .

— is of two types.

(1) Completely Randomized design (CRD) : one way classification | factors | ~~levels~~ — also called one way ANOVA

(2) Randomized Block design (RBD) : Two way classification | factors — also called Two way ANOVA.



→ CRD | One way ANOVA | One way factors:-

↳ Involves only one factor.

↳ one factor may have k levels |  
~~groups~~ Samples.

Group/factors	Observations	
1	$x_{11}, x_{12}, \dots, x_{1n_1}$	$\bar{x}_1$
2	$x_{21}, x_{22}, \dots, x_{2n_2}$	$\bar{x}_2$
⋮	⋮	⋮
K	$x_{K1}, x_{K2}, \dots, x_{Kn_K}$	$\bar{x}_K$
		Overall mean $\bar{x}$

Ex	Teaching methods	Observations			
	online	12	34	35	43
	offline	21	23	25	
	Recorded	23	32	34	39 45

Three kinds of variations in ANOVA:-

(1) Between groups :- Variation from one group to another  
 $\sum n_i (\bar{x}_i - \bar{x})^2$

(2) Within groups :- Variations among the observations of each specific group

$$\sum_{i=1}^k \sum_{j=1}^{n_i} (x_{ij} - \bar{x}_i)^2$$

(3) Total :- Variations among all the observations.  
(Sum of between groups & within groups).  
 $\sum \sum (x_{ij} - \bar{x})^2$

## F ratio | ANOVA :

F ratio | ANOVA is defined as

$$F = \frac{\text{Mean Sum of Squares b/w groups}}{\text{Mean Sum of Squares Within groups}}$$

Assumption (1) Samples are randomly drawn from normal population

$$(2) \quad \text{All } \sigma_1^2 = \sigma_2^2 = \dots = \sigma_k^2$$

(3) Total variance should be equal to sum of Square b/w groups and within groups.

## ANOVA Testing

$$H_0: \mu_1 = \mu_2 = \dots = \mu_k$$

i.e. there is no significant difference b/w the mean of all groups.

$H_1$ : There is atleast one group means different from others.

### One way ANOVA Summary table

Sources of Variation	d.f.	S.S.	$MSS = SS/d.f$	F-ratio
	(1)	(2)	(2)/(1)	
B/W groups	-	-		
Within groups	-	-		
Total	-	-		

df - degree of freedom

SS - sum of squares

MSS - mean sum of squares.

Two method to calculate Sum of Squares (SS) :-

$$(1) \text{ SS b/w groups} = \sum n_i (\bar{x}_i - \bar{x})^2$$

$$\text{SS Within groups} = \sum \sum (x_{ij} - \bar{x}_i)^2$$

$$\text{SS total} = \sum \sum (x_{ij} - \bar{x})^2$$

(2)	Groups	Observations	Total
1	$x_{11}$ $x_{12}$	-	$T_1$
2	$x_{21}$ $x_{22}$	-	$T_2$
i		:	
K	$x_{K1}$ $x_{K2}$	-	$T_K$
.		Grand Total = G	

$$(1) C = \frac{G^2}{N} - N - \text{total no. of elements.}$$

$$(2) \text{ SS total} = \sum \sum (x_{ij}^2 - C)$$

$$(3) \text{ SS b/w group} = \sum_{i=1}^K \left( \frac{T_i^2}{n_i} - C \right)$$

$$(4) \text{ SS Within group} = \text{SS Total} - \text{SS b/w group.}$$

Ques In an experiment to determine the effect of nutrition on the attention time of elementary school students, a group of 15 students were randomly assigned to each of three meal plans:- no breakfast, light breakfast and full breakfast. Their attention minutes were recorded during a morning reading period and shown as

No Breakfast      8      7      9      13      10

Light Breakfast    14      16      12      17      11

Full Breakfast     10      12      16      15      12

Construct the ANOVA table for this experiment.

Soln

Meal	Total
No Breakfast	47

Light Breakfast	14	16	12	17	11	70
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Full Breakfast	10	12	16	15	12	$\frac{65}{G=182}$
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$$C = \frac{G^2}{N} = \frac{182^2}{15} = 2208.26$$

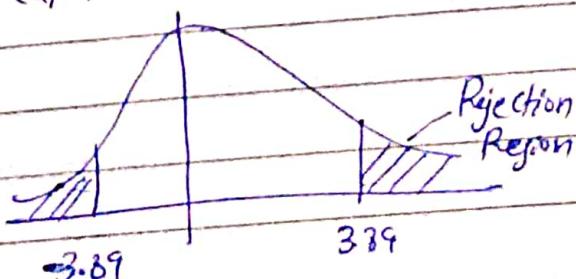
$$\begin{aligned} SS_{\text{total}} &= \sum \sum x_{ij}^2 - C \\ &= (8^2 + 7^2 + \dots + 12^2) - 2208.26 \\ &= 129.73 \end{aligned}$$

$$\begin{aligned} SS_{\text{b/w groups}} &= \sum_{i=1}^3 \left( \frac{T_i^2}{n_i} \right) - C \\ &= \frac{47^2}{5} + \frac{70^2}{5} + \frac{65^2}{5} - 2208.26 \\ &= 58.53. \end{aligned}$$

	D.F.	SS	MSS = SS/D.F.	F-ratio
B/w groups	2 = (3-1)	58.53	58.53/2 = 29.26	29.26/5.93
Within groups	12	71.20	71.20/12 = 5.93	= [4.93]
Total	14 = (15-1)	129.73		

Table is  $F_{(2,14)}(\alpha) = F_{(2,14)}(0.05) = 3.89$   
value

$\therefore F \text{ value} > 3.89$   
 $\Rightarrow \text{Reject H}_0$ .



Ques A truck company wants to test the avg life of each of the 4 brands of tyres. The Company uses all brands on randomly selected trucks. The records showing the lives (thousands of miles) are given as follows:

Brand 1	20	23	18	17	
2	19	15	17	20	16
3	21	19	20	17	16
4	15	17	16	18	

Test the hypothesis that the avg life for each brand of tyres is the same at 1% level of significance.

Soln Subtract 20 (or any no.) from each observation.

	Total				
Brand 1	0	3	-2	-3	-2
Brand 2	-1	-5	-3	0	-4
Brand 3	1	-1	0	-3	-4
Brand 4	-5	-3	-4	-2	-14
					<u><math>q = \frac{-36}{18}</math></u>

$$C = \frac{q^2}{N} = \frac{(-36)^2}{18} = 72$$

$$\begin{aligned} SS_{\text{total}} &= \sum \sum (x_{ij})^2 - C \\ &= (0^2 + 3^2 + \dots + (-2)^2) - 72 \\ &= 82 \end{aligned}$$

$$\begin{aligned} SS_{\text{b/w groups}} &= \left( \frac{\sum T_i^2}{n_i} \right) - C \\ &= \left( \frac{4}{34} + \frac{169}{5} + \frac{49}{5} + \frac{196}{4} \right) - 72 \\ &= 21.6 \end{aligned}$$

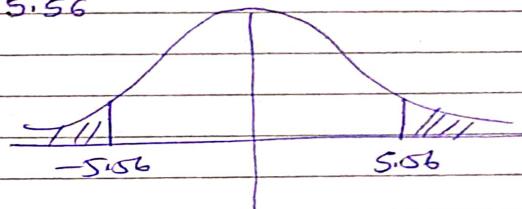
$$SS_{\text{within groups}} = 82 - 21.6 = 60.4$$

### ANOVA table

	d.f.	S.S.	M.S.S.	F-ratio
B/w groups	3 = (4-1)	21.6	7.2	(1.67)
within groups	14	60.4	4.31	
Total	18-1=17	82		

table value  $F_{(3,14)}(0.01) = 5.56$

$\therefore F\text{value} < F_{(3,14)}(0.01)$   
 $\Rightarrow \text{Do not reject } H_0.$



Ques

Brands	(Detergent Brands)					Total
	A	B	C	D	G	
A	77	81	61	76	69	364
B	74	66	58			198
C	73	78	57	69	63	340
D	76	85	77	64		302
					G =	1204

Test the hyp that there is no difference b/w the four brands as regards mean whiteness readings after washing.

$H_0: \mu_1 = \mu_2 = \mu_3 = \mu_4$  i.e.  $\mu_i = \mu - \epsilon_i$

$H_1: \mu_i \neq \mu$  for some  $i$   
 $\alpha = 0.05$

$$C = \frac{G^2}{N} = \frac{(1204)^2}{17} =$$

$$SS_{\text{total}} = 1090.47$$

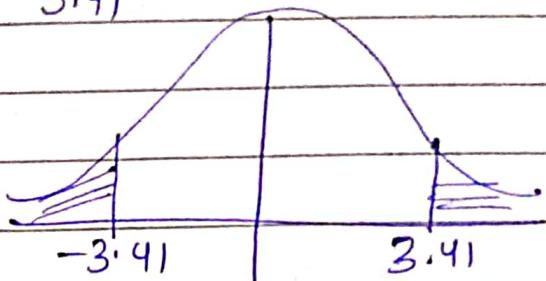
$$SS_{\text{b/w gbs}} = 216.67$$

$$\Rightarrow SS_{\text{within gbs}} = 873.8$$

ANOVA table is	d.f	SS	MSS	F-ratio
B/w groups	4-1=3	216.67	72.22	1.07
Within groups	13	873.8	67.21	
Total	17-1=16	1090.47		

$$F_{3,13} (0.05) = 3.41$$

$1.07 < 3.41$   
 $\Rightarrow$  Don't Reject  $H_0$ .



Ques

The following data gives the lifetimes in hours of 3 types of batteries.

Type I	50.1	49.9	49.8	49.7	50
Type II	51.0	50.8	50.9	50.9	50.6
Type III	49.5	50.1	50.2	49.8	49.3

Analyse this data for a difference b/w mean lifetimes  
 (use 5% level of significance)

Ques

Car	27	45	33	31
Bicycle	34	38	43	42
Bus	26	41	35	46

Carry out an ANOVA and test at 5% LOS whether there are differences in the mean journey times for the 3 methods of transport.

Two way ANOVA / RBD → Two factors are Considered.

Eg Factors :- Teaching methods & Intelligence

Levels :- Teaching Methods :- online, offline and Video lecture.

Intelligence :- High, Average and Low.

Teaching Methods

	Online	Offline	Video Lecture
High	-	-	-
Avg	-	-	-
Low	-	-	-

→ When Two-way ANOVA Can be used?

Ans = When no. of observations in each row are equal and in each Column are equal then only Two-way ANOVA Can be used.

Eg.

A	23	21	24	25	] 1-way ANOVA.
B	28	29	33		
C	34	45	50	36	

Eg

	P	Q	R	S	] 2-way ANOVA.
A	23	21	45	42	
B	25	24	36	23	
C	28	27	33	40	

→ As there are two factors, we need 2 hypotheses.

Hypothesis for factor 1:  $\rightarrow$

$H_0$ : There is no significant diff b/w the means of the row factors. i.e.  $\mu_i = \mu$

$H_1$ : there is significant difference b/w the means of row  $\mu_i \neq \mu$

Hyp. for factor 2:  $\rightarrow$

$H_0$ : There is no significant diff b/w the means of the Column factors. i.e.  $\mu_j = \mu$

$H_1$ : There is significant diff b/w the means of the Column factors. i.e.  $\mu_j \neq \mu$ .

### Source table for Two-way ANOVA

Source of Variation	d.f.	SS	MSS = $\frac{SS}{df}$	F-ratio
B/w rows	$(r-1)$	SSR	$mSSR$	$mSSR/mSSE$
B/w Columns	$(c-1)$	SSC	$mSSC$	$mSSC/mSSE$
Within	$(r-1)(c-1)$	SSE	$mSSE$	
Total	$rc-1$	SST		

$r$  = no. of rows;  $c$  = no. of columns

df - deg. of freedom; SS - sum of squares.

MSS - mean sum of squares.

Columns

		P	Q	R	S		$C = \frac{\sum G_i^2}{N}$
		T <sub>A</sub>	T <sub>B</sub>	T <sub>C</sub>			
Rows	A						
	B						
C							

$$T_P T_Q T_R \quad \sum G_i = \sum T_i$$

$$SSR = \sum_i \frac{T_i^2}{n_i} - C$$

$$SSC = \sum_j \frac{T_{ij}^2}{n_j} - C$$

$$SST = \sum \sum x_{ij}^2 - C$$

$$SSE = SST - SSR - SSC.$$

Ex: →

	Yield			
Fertilizers	A	B	C	D
Nitrogen	6	4	8	6
Potash	7	6	6	9
Phosphates	8	5	10	9

A farmer applies 3 type of fertilizers on 4 plots. The figures on yield per acre are given in table. Test if there is any significant difference in fertility of the plots.

Sol: →

$H_0: \mu_1 = \mu_2 = \mu_3$  i.e. three fertilizers are equally effective

$H_0: \mu_A = \mu_B = \mu_C = \mu_D$  i.e. four plots are equally fertile

	Yield			
	A	B	C	D
N	6	4	8	6
P	7	6	6	9
Ph	8	5	10	9
	21	15	24	24
				<u>84</u>

$$C = \frac{G^2}{N} = \frac{(84)^2}{12} = 588$$

$$SSR = \sum \frac{T_i^2}{n_i} - C = \frac{(24)^2}{4} + \frac{(24)^2}{4} + \frac{(32)^2}{4} - 588 \\ = 8$$

$$SSC = \frac{(21)^2}{3} + \frac{(15)^2}{3} + \frac{(24)^2}{3} + \frac{(24)^2}{3} - 588 = 18$$

$$SST = \sum \sum x_{ij}^2 - C \\ = 6^2 + 4^2 + \underline{\quad} + 9^2 - 588 = 36$$

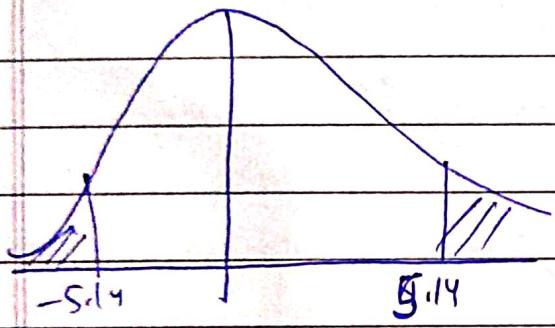
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### Two way ANOVA table

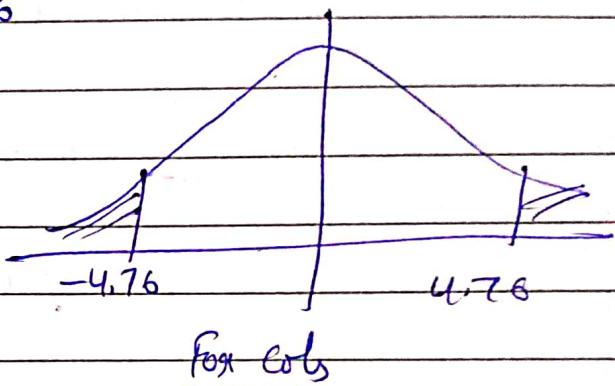
	df	SS	MSS	F-ratio
B/w Rows	3-1=2	8	$8/2 = 4$	$4/1.67 \approx 2.39$
B/w Cols	4-1=3	18	$18/3 = 6$	$6/1.67 = 3.593$
Within error	6	10	$10/6 = 1.67$	
Total	12-1=11	36		

$$F(2,6) (0.05) = 5.14$$

$$F(3,6) (0.05) = 4.76$$



Total rows



Total cols

We fail to reject both the null hypothesis.