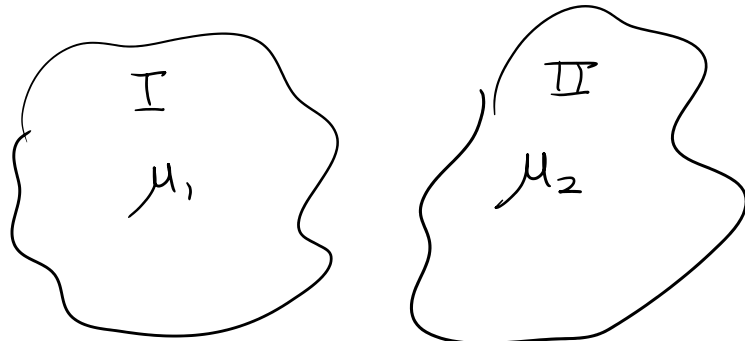


# One-Way ANOVA

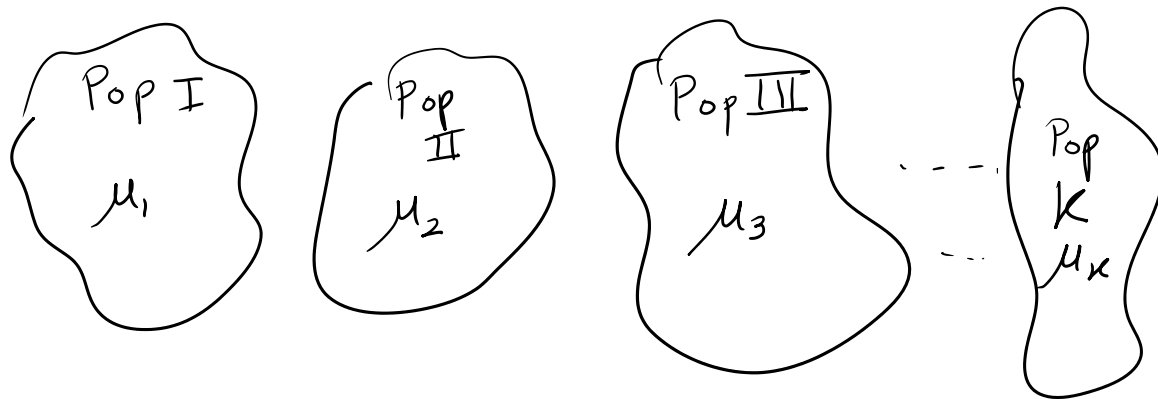
## Analysis of Variance

- Parametric test which assumes Normal Distribution of all populations

2 Indep  
Samples



$$\mu_1 \stackrel{?}{=} \mu_2$$



$$H_0: \mu_1 = \mu_2 = \mu_3 = \dots = \mu_k$$

$H_1$ : At least one  $\mu_j$  is different  $j=1, 2, \dots, k$

$$H_0: \mu_1 = \mu_2 = \mu_3 = \mu_4$$

I	II	III	IV
23.4	34.2	23.8	36.7
24.1	45.2	24.5	39.5
19.6	24.9	29.3	43.2
23.9	40.3	18.3	50.2
29.4	39.4	19.4	47.2
21.9	35.3		34.1
	38.4		

		Yield
Treatments		
I	$\bar{x}_1$	23.716667
II	$\bar{x}_2$	36.814286
III	$\bar{x}_3$	23.060000
IV	$\bar{x}_4$	41.816667

$H_1$ : At least one  $\mu_j$  is different

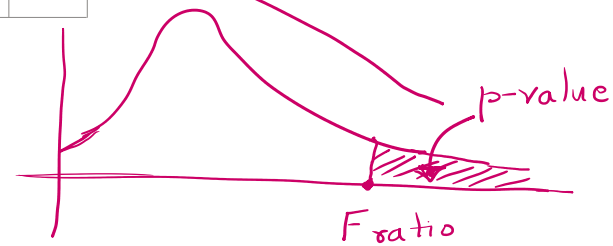
Sources of Variation	Sums of Squares	Degrees of Freedom	Mean Square	F Ratio	P-Value
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Sources of Variation	Sums of Squares	Degrees of freedom	Mean Square	F Ratio	P-Value
Treatment	SSTR	$r - 1$	$MSTR = SSTR / (r - 1)$	$MSTR / MSE$	
Error	SSE	$n - r$	$MSE = SSE / (n - r)$		
Total	SST	$n - 1$			

F-ratio follows F-Distribution

MSTR : Variation bet<sup>n</sup> Treatments

MSE : Variation within Treatment (Error Mean)



	sum_sq	df	F	PR(>F)
Treatments	1551.607762	3.0	18.293252	0.000006 < 0.05
Residual	565.457238	20.0	NaN	NaN

∴ We reject  $H_0$  at 5% l.o.s.

All 4 treatments might not be having same effect.

group1	group2	meandiff	p-adj	lower	upper	reject
I	< II	13.0976	0.0014	4.8177	21.3775	True
I	= III	-0.6567	0.9969	-9.6685	8.3552	False
I	< IV	18.1	0.0001	9.5075	26.6925	True
II	> III	-13.7543	0.0014	-22.4686	-5.0399	True
II	= IV	5.0024	0.3541	-3.2775	13.2823	False
III	< IV	18.7567	0.0001	9.7448	27.7685	True

Every line's Hypothesis test

$H_0$ : group 1 = group 2

$H_1$ : group 1  $\neq$  group 2

$$\left. \begin{array}{l} I < II, IV \\ III < II, IV \end{array} \right\} \underbrace{I, III} < \underbrace{II, IV}$$

```
In [31]: plant['group'].unique()
Out[31]: array(['ctrl', 'trt1', 'trt2'],
dtype=object)
```

$H_0: \mu_{ctrl} = \mu_{trt1} = \mu_{trt2}$

```
In [35]: ols_plant = ols('weight ~ group', data=plant).fit()
...: table = anova_lm(ols_plant, typ=2)
...: print(table)
```

	sum_sq	df	F	PR(>F)
group	2.76624	2.0	4.84688	0.01501 < 0.05

```

... table = anova_lm(ols_plant, typ=2)
... print(table)

```

	sum_sq	df	F	PR(>F)
group	3.76634	2.0	4.846088	0.01591 < 0.05
Residual	10.49209	27.0	NaN	NaN

∴ We reject  $H_0$  at 5% l.o.s.

group1	group2	meandiff	p-adj	lower	upper	reject
ctrl	trt1	-0.371	0.3909	-1.0622	0.3202	False
ctrl	trt2	0.494	0.198	-0.1972	1.1852	False
trt1	trt2	0.865	0.012	0.1738	1.5562	True

← rejected

grp2 - grp1

$t_{r2} - t_{r1} > 0$

$t_{r2} > t_{r1}$

Cars93.csv :-

$H_0: \mu_{\text{no airbag}} = \mu_{\text{Driver airbag}} = \mu_{\text{D \& P airbags}}$

```

In [40]: ols_air = ols('Price ~ AirBags', data=cars93).fit()
... table = anova_lm(ols_air, typ=2)
... print(table)

```

	sum_sq	df	F	PR(>F)
AirBags	2746.983995	2.0	21.177572	2.901187e-08 < 0.05
Residual	5837.037296	90.0	NaN	NaN

∴ We reject  $H_0$  at 5% l.o.s.

Price Means w.r.t airbags may be different  
 $\Rightarrow$  Price is influenced by Air Bags

grp2 - grp1

	group1	group2	meandiff	p-adj	lower	upper	reject
①	Driver & Passenger	Driver only	-7.1455	0.0089	-12.7657	-1.5253	True
	Driver & Passenger	None	-15.1952	0.0	-21.0136	-9.3768	True
	Driver only	None	-8.0497	0.0001	-12.4542	-3.6453	True

① Drive Only < Drive P

② None < Drive P

③ None < Drive only

$\Rightarrow$  None < Drive only < Drive Pass.

$H_0: \mu_{\text{USA}} = \mu_{\text{non-USA}}$

```
In [43]: ols_org = ols('Price ~ Origin', data=cars93).fit()
...: table = anova_lm(ols_org, typ=2)
...: print(table)
```

	sum_sq	df	F	PR(>F)
Origin	87.050054	1.0	0.93228	0.33683
Residual	8496.971236	91.0	NaN	NaN

∴ We don't reject  $H_0$  at 5% l.o.s.  
Price is unaffected by Origin

$$H_0: \mu_s = \mu_c = \mu_m = \dots$$

```
In [45]: ols_type = ols('Price ~ Type', data=cars93).fit()
...: table = anova_lm(ols_type, typ=2)
...: print(table)
```

	sum_sq	df	F	PR(>F)
Type	3421.435111	5.0	11.531618	1.476999e-08
Residual	5162.586180	87.0	NaN	NaN

∴ We reject  $H_0$  at 5% l.o.s.  
Price is affected by Type.

grp2-grp1

group1	group2	meandiff	p-adj	lower	upper	reject
Compact	Large	6.0875	0.341	-2.7052	14.8802	False
Compact	Midsize	<u>9.0057</u>	0.0078	1.6298	16.3816	True
Compact	Small	<u>-8.0458</u>	0.0265	-15.4953	-0.5964	True
Compact	Sporty	<u>1.1804</u>	0.9983	-7.0351	9.3958	False
Compact	Van	0.8875	0.9998	-8.4662	10.2412	False
Large	Midsize	2.9182	0.908	-5.3716	11.208	False
Large	Small	<u>-14.1333</u>	0.0001	-22.4887	-5.778	True
Large	Sporty	<u>-4.9071</u>	0.6131	-13.9521	4.1378	False
Large	Van	-5.2	0.664	-15.29	4.89	False
Midsize	Small	<u>-17.0515</u>	0.0	-23.9002	-10.2028	True
Midsize	Sporty	<u>-7.8253</u>	0.043	-15.5002	-0.1505	True
Midsize	Van	<u>-8.1182</u>	0.0934	-17.0008	0.7645	False
Small	Sporty	<u>9.2262</u>	0.0102	1.4806	16.9718	True
Small	Van	<u>8.9333</u>	0.0504	-0.0105	17.8772	False
Sporty	Van	-0.2929	1.0	-9.8841	9.2984	False

midsize > Compact > small  
large > small  
midsize > Sporty  
Sporty > small