

Anova (Analysis of Variance)

extend t -tests to situations

with more than one indep. var.

and/or more than two treatment levels

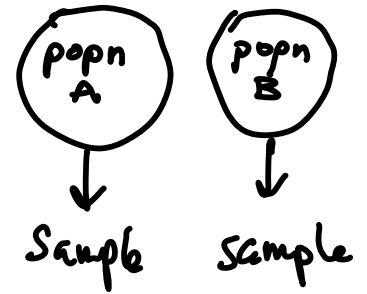
for any indep. var.

REVIEW

Between-Subjects t-test

$$H_0: \mu_A = \mu_B \quad (\mu_A - \mu_B = \phi)$$

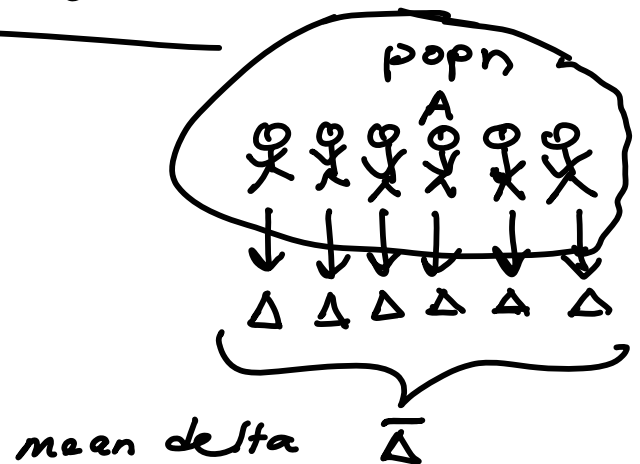
$$H_1: \mu_A \neq \mu_B \quad (\mu_A - \mu_B \neq \phi)$$



Within / Matched Subject t-test

$$H_0: \mu_{\bar{\Delta}} = \phi$$

$$H_1: \mu_{\bar{\Delta}} \neq \phi$$

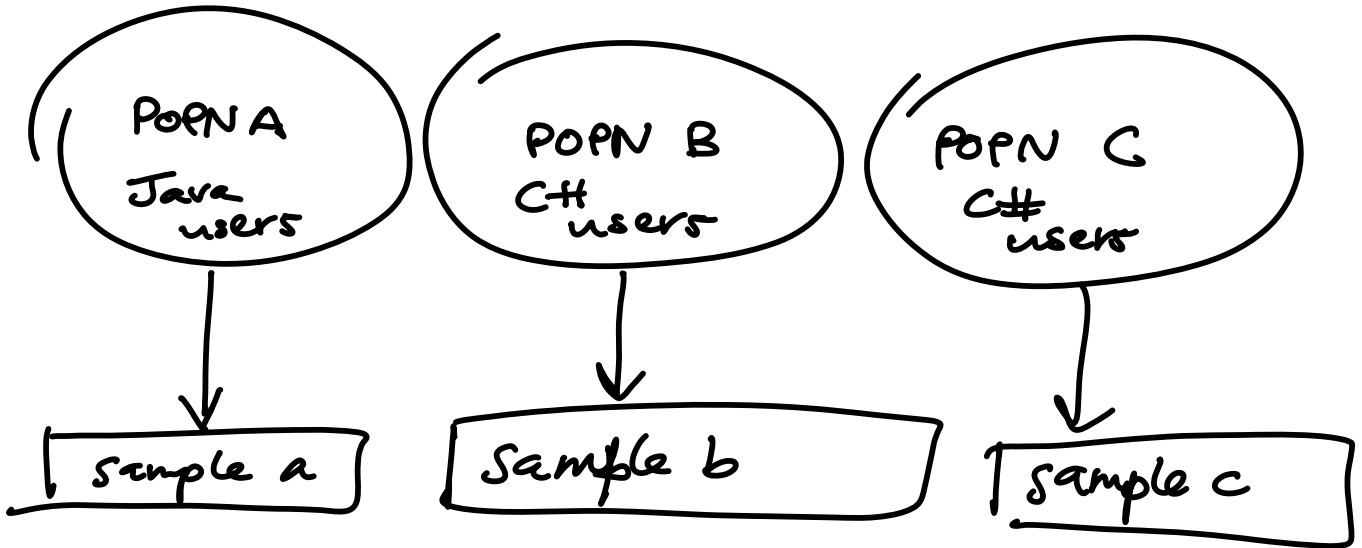


t-tests rely on measuring differences b/w sample scores or sample statistics.

ANOVA generalizes that approach by measuring variances between and within sample groups.

Independent Measures One-Way ANOVA

(between-subjects, only one indep. var.)



H_0 : $\mu_A = \mu_B = \mu_C$ is true

H_1 : $\mu_A = \mu_B = \mu_C$ is not true.

prove or disprove H_0 with

F-statistic: variance between sample means

variance expected by chance

ANOVA Vocab

SS = sum of squares
(numerator of variance) $\sum (x_i - \bar{x})^2$

df = degrees of freedom $n-1$
(denominator of variance)

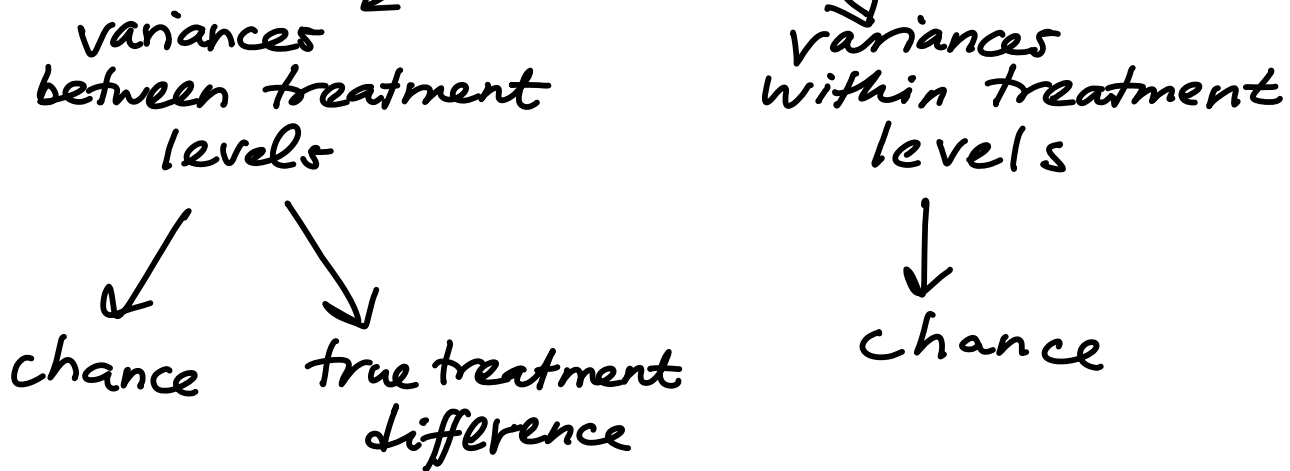
MS = mean square (variance) s^2 or var

factor: indep. variable

	$n=5$ Java	$n=5$ C++	$n=5$ C#	$k=3$
# Errors Made	0 1 3 1 0	4 3 6 3 4	1 2 2 0 0	$N=15$
	$\bar{x}_{java} = 1$	$\bar{x}_{c++} = 4$	$\bar{x}_{c\#} = 1$	

Variability everywhere!

2 sources
of variability



chance: natural variation b/w subjects, measurement error

F - statistic

$$F = \frac{\text{variation between treatments} \\ \text{(chance + true treatment effect)}}{\text{variation within subjects} \\ \text{(chance)}}$$

H_0 : true treatment effect = ϕ

probably true when $F \approx 1$

probably false when $F \gg 1$

	$n=5$ Java a	$n=5$ C++ b	$n=5$ C# c	$k=3$
# Errors Made	0 1 3 1 0	4 3 6 3 4	1 2 2 0 0	$N=15$
	$\Sigma a = 5$ $\bar{a} = 1$	$\Sigma b = 20$ $\bar{b} = 4$	$\Sigma c = 5$ $\bar{c} = 1$	TOTAL Σ : 30 OVERALL MEAN = 2

F-statistic = $\frac{\text{variance between treatments}}{\text{variance within tr.}}$

	SS	df	var = $\frac{SS}{df}$	F = $\frac{\text{var b/w}}{\text{var within}}$
b/w tr.	30	2	15	11.28
within tr	$6+6+4$ $= 16$	12	$1\frac{1}{3}$	$15 / \frac{4}{3}$
TOTAL	46	$N-1$ $= 14$	$46/14 = 3.28$	

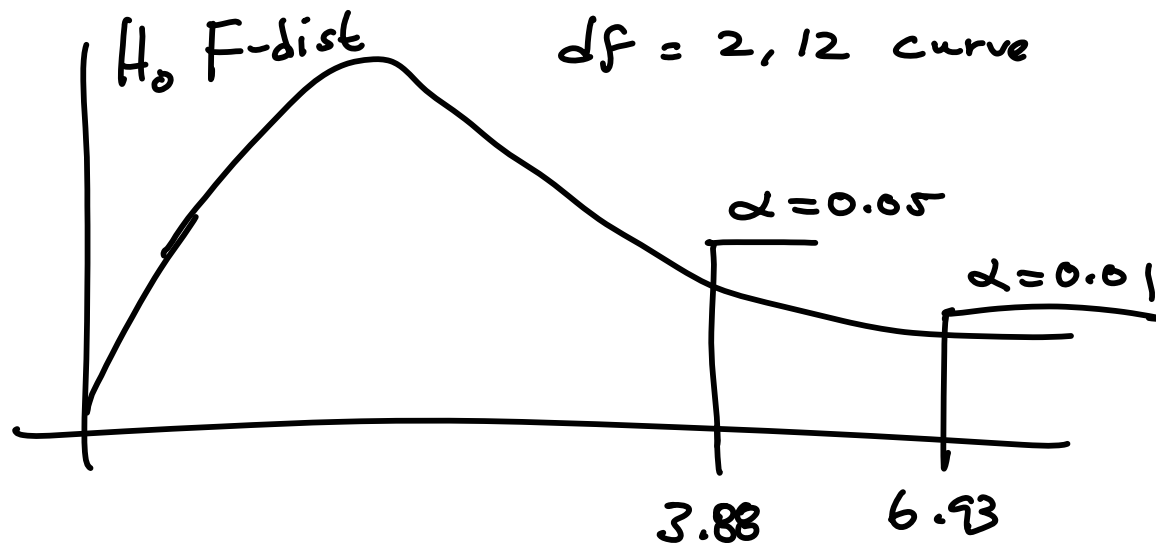
$$\sum (x - \text{OVERALL MEAN})^2$$

$$\begin{aligned}SS_{\text{TOTAL}} &= (-2)^2 + (-1)^2 + (1)^2 + (-1)^2 + (-2)^2 \\ &\quad + (2)^2 + (1)^2 + (4)^2 + (1)^2 + (2)^2 \\ &\quad + (-1)^2 + (\emptyset)^2 + (\emptyset)^2 + (-2)^2 + (-2)^2 \\ &= 46.\end{aligned}$$

$$\begin{aligned}SS_{\text{within}} &= \sum SS_{\text{each treatment level}} \\ &= 6 + 6 + 4 = 16\end{aligned}$$

F-statistic: 11.28

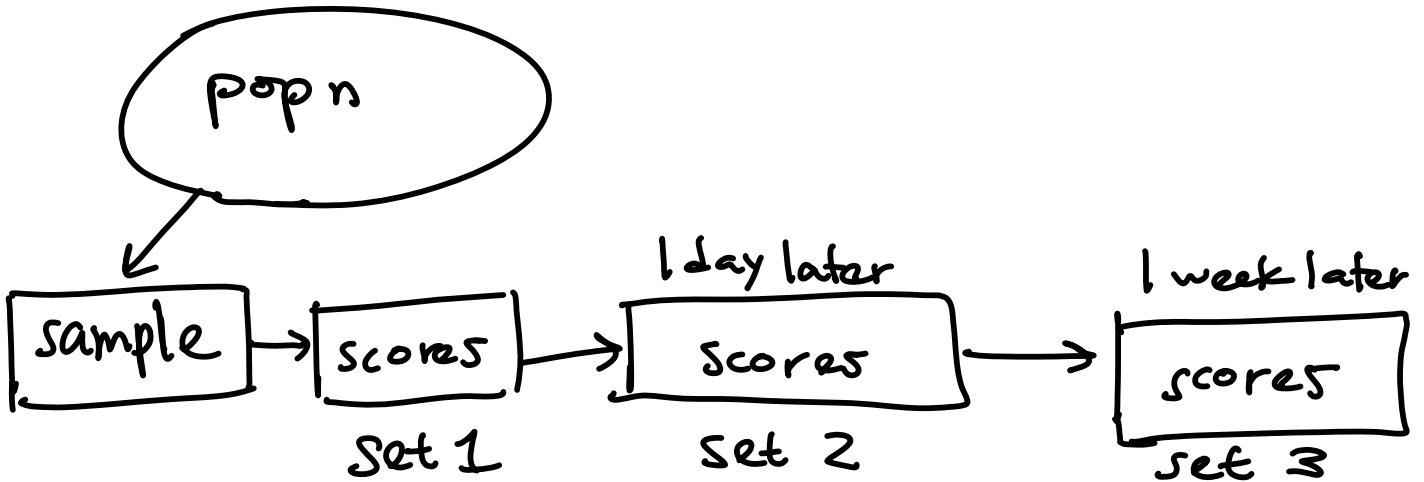
Family of F-distributions



11.28 > 6.93 H₀ disproven.

Repeated Measures Single Factor Anova

- Within-subjects / matched subjects
- one indep. var.



Within Subjects / Matched Subjects ANOVA

$H_0: \mu_1 = \mu_2 = \mu_3$ is true

$H_1: \mu_1 = \mu_2 = \mu_3$ is not true

F-statistic: variance b/w treatments (no indiv. differences)

variance expected by chance

- individual differences

	# Questions Answered Right				subj
	Google ^G	Ask.com ^A	Clusty ^C	Ice Rocket ^I	
Amir	3	4	6	7	5
Bela	0	3	3	6	3
Dina	2	1	4	5	3
Jayant	0	1	3	4	2
Lisa	0	1	4	3	2

$$\Sigma g = 5 \quad \Sigma a = 10 \quad \Sigma c = 20 \quad \Sigma i = 25$$

$$\bar{g} = 1 \quad \bar{a} = 2 \quad \bar{c} = 4 \quad \bar{i} = 5$$

$$n = 5$$

$$k = 4$$

$$N = 20$$

$$\text{TOTAL SUM} = 60$$

$$\text{OVERALL MEAN} = 3$$

$$F\text{-statistic} = \frac{\text{variance between treatments} + (\text{true treatment effect} + \text{residual variance})}{\text{residual variance} (\text{chance} - \text{individual differences})}$$

	SS	df	var = $\frac{SS}{df}$	F = $\frac{\text{var b/w tr.}}{\text{var resid.}}$
b/w tr.	50	3	$50/3 = 16.67$	25
within tr	32	16		F(3, 12)
b/w subj.	24	4		
residual	8	12	$8/12 = 0.67$	
Total	82	19		

SS between subject (aka SS_{block})

$$= k \sum \left(\overline{\text{subject}} - \text{OVERALL MEAN} \right)^2$$

$$= 4 \left[\begin{array}{ccccc} (5-3)^2 & + & \emptyset^2 & + & \emptyset^2 & + & (2-3)^2 & + & (2-3)^2 \\ \text{AMIR} & & \text{BELA} & & \text{DINA} & & \text{JAY} & & \text{LISA} \end{array} \right]$$

$$= 24.$$

Assumptions of ANOVA

- ① observations between each treatment condition must be indep.
- ② within each treatment \rightarrow normal
- ③ popn variances are equal.

Post - Hoc Tests

H_0 only says

$$\left\{ \begin{array}{l} \mu_A = \mu_B = \mu_C \dots \\ \mu_1 = \mu_2 = \mu_3 \dots \end{array} \right. \text{ is FALSE.}$$

But \rightarrow which means are significantly different?

Need to do pairwise comparisons of means

- ① Pairwise t -tests
 - ② Tukey's HSD
 - ③ Scheffé Test
- } use data
from ANOVA
computation