

This time: ANOVA

Next time: (1 Dec) ANOVA, categorical data

Read: LN pp. L-(283) → L-(301)

This time: L-(269) →

Note: (24) on Pg. 30 helps explain how accurate predictions are

Continuing the poplar tree study: 4 independent samples, continuous

new notation:  $Y_{ij}$  subgroups need 2 indexes (which of the 4 groups, which individual tree) ( $s_1, s_2, s_3, s_4$ )

Basic model: assume  $\sigma_1 = \sigma_2 = \sigma_3 = \sigma_4$  so use  $\sigma$  for all

4 groups have 6 possible ways to compare 2 at a time

Multiple Comparisons Problem: making more than 1 CI means more errors

interval method is better than strait p-value calculations

weighted mean = "votes" according to how many observations there are

$n$  = total number of subjects, est. of  $\mu$  (grand mean)

Measure of the extent to which  $\bar{y}_i$  is (NOT) close to  $\bar{y}$ :

$$SS_B \text{ (between groups sum of squares) (JMP calls it "treatment" here)}$$

$$\sum_{i=1}^I n_i (\bar{y}_i - \bar{y})^2 \quad (\text{the answer is squared})$$

Things that increase  $SS_B$  even if null is true:

① As  $I$  (number of groups) increases

easy fix: divide by  $\sim I \rightarrow \frac{1}{I-1} \sum_{i=1}^I n_i (\bar{y}_i - \bar{y})^2 = \frac{SS_B}{DF_B} = MS_B$

↖ mean square between groups  
↖ degrees of freedom between

② (worse!) changing units can make  $SS_B$  arbitrarily bigger/smaller

fix: create  $\frac{\text{signal} \leftarrow MS_B}{\text{noise}}$  ratio get a unitless quantity F-ratio (Fisher)

can you put any number to get that mean?

1
2
9

$n=3$   
mean  $\bar{y}=4$

O✓
O✓
X

mean  $\bar{y}=4$

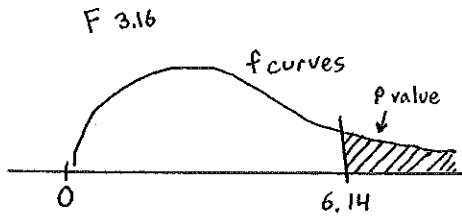
so 2 degrees of freedom!

with 2 obs., there are  $(n-1)$  df for spread

(2)

$\sum_{i=1}^I \sum_{j=1}^{n_i}$  ← double summation called  $SS_w$  (within-group sum of squares, JMP calls it "error")

ratio is  $\hat{\sigma}^2 = \frac{SS_w}{DF_w} = MS_w =$  with group mean square



Long run hist of F if null true  
& all pop. hist groups follow normal curve well

$P = 0.0056 \approx 0.6\%$  so null looks bad. diffs are statsig. (greater than 0.5%)

ANOVA Decomposition (breakdown)

SST = total sum of squares (JMP calls it <sup>corrected</sup> C. total)

Check pp. L-(272) for annotated JMP, table on (R-30) to understand JMP labels in analysis of variance

Step 1: decide how many comparisons to make, K

Step 2: decide the level of confidence  $100(1-\alpha)\%$

Step 3: pairwise comparisons will be the form  $(\bar{y}_i - \bar{y}_j)$  & will have estimated standard error:

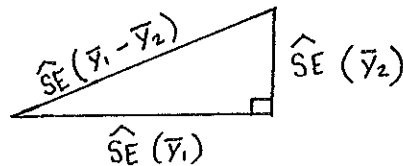
$$\widehat{SE}(\bar{y}_i - \bar{y}_j) = \hat{\sigma} \sqrt{\frac{1}{n_i} + \frac{1}{n_j}}$$

2 indep. samples:

group	n	$\bar{y}$	s
1	$n_1$	$\bar{y}_1$	$s_1$
2	$n_2$	$\bar{y}_2$	$s_2$

$$\widehat{SE}(\bar{y}_1 - \bar{y}_2) = \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$$

$$= \sqrt{\left(\frac{s_1}{\sqrt{n_1}}\right)^2 + \left(\frac{s_2}{\sqrt{n_2}}\right)^2}$$



$$SE(\bar{y}_1) = \frac{\sigma_1}{\sqrt{n_1}}$$

$$SE(\bar{y}_2) = \frac{\sigma_2}{\sqrt{n_2}}$$

$$SE(\bar{y}_1 - \bar{y}_2) = \sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

③

now suppose  $\sigma_1 = \sigma_2 = \sigma$

$$\begin{aligned} SE(\bar{y}_1 - \bar{y}_2) &= \sqrt{\frac{\sigma^2}{n_1} + \frac{\sigma^2}{n_2}} = \sqrt{\sigma^2 \left( \frac{1}{n_1} + \frac{1}{n_2} \right)} \\ &= \sigma \sqrt{\frac{1}{n_1} + \frac{1}{n_2}} \end{aligned}$$

root mean squared error =  $\sqrt{MSW}$  ( $\hat{\sigma}^2 = MSW =$  "pooled variance estimate")

③ How wide should variables be?

fix: use a bigger  $t$  number to widen all the intervals

$$t_{n-1}^{1-\frac{\alpha}{k}}$$

④  $\hat{SE}$  of est. diff

$$\hat{\sigma} = RMSE \quad \hat{SE} = \hat{\sigma} \sqrt{\frac{1}{n-1} + \frac{1}{n-1}}$$

⑤ Look to see which CI's don't include 0 - these are statsig. pairwise differences.

summarize & interpret the results

The F tables are in the notes (we won't be doing many calculations, we'll be given JMP values w/p-values already computed)

Homework #5: fecundity = reproductive success      drosophila = fruit flies

outcome variable: close to continuous, 3 groups, independent, an ANOVA problem