

Stat 411/511

## EXTRA SS F-TEST

Nov 6 2015

# Quiz #3

Today noon - Monday noon

Same format, two sections, 30mins each

Short answer you need to be able to do  $\exp(x)$

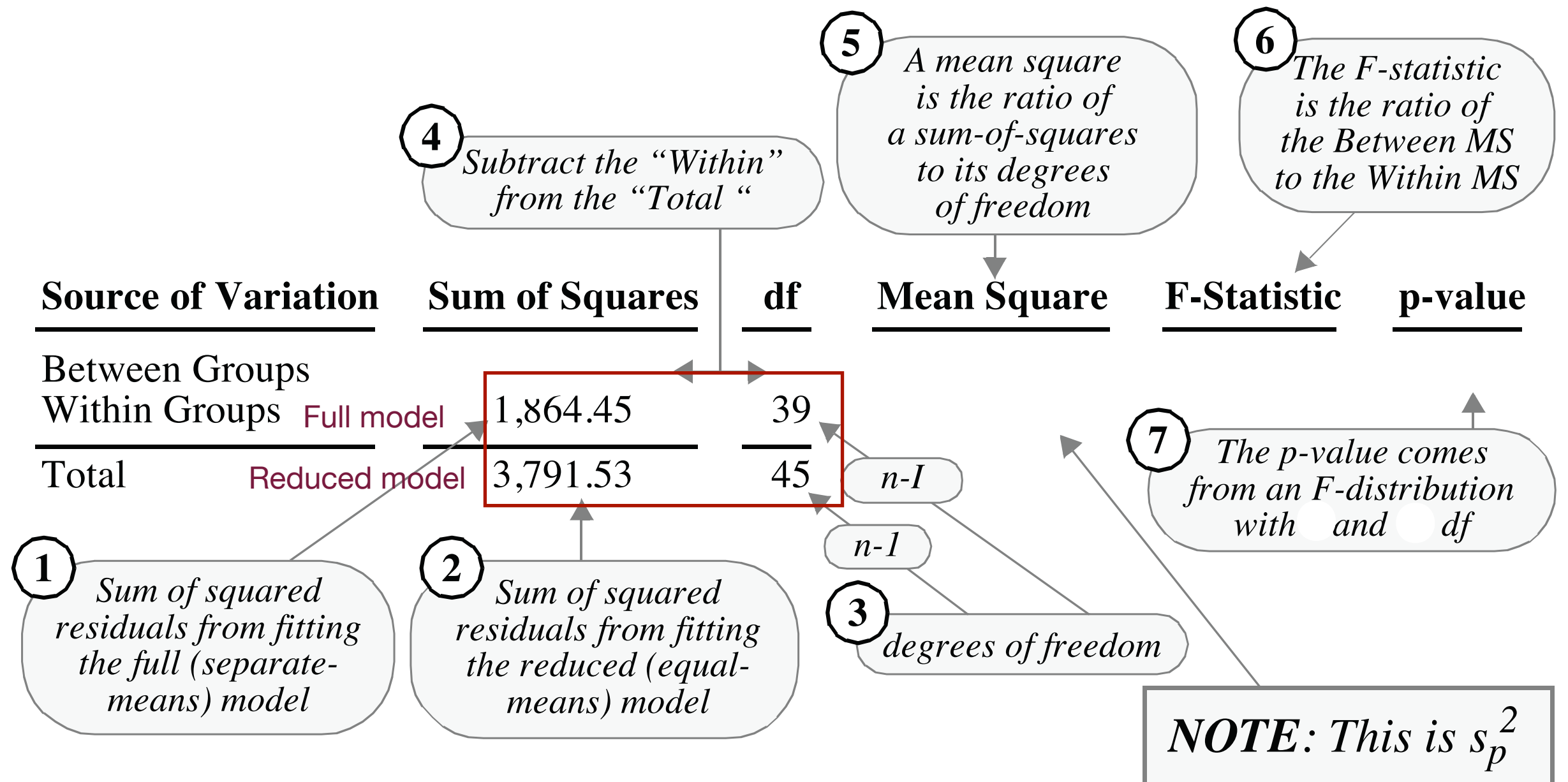
# The ANOVA table

a convenient way to lay the calculations out

Display 5.10

p. 127

Analysis of variance table: a test for equal mean percents of women in venires of seven judges; Spock data



# The p-value is always one-sided for the F-test

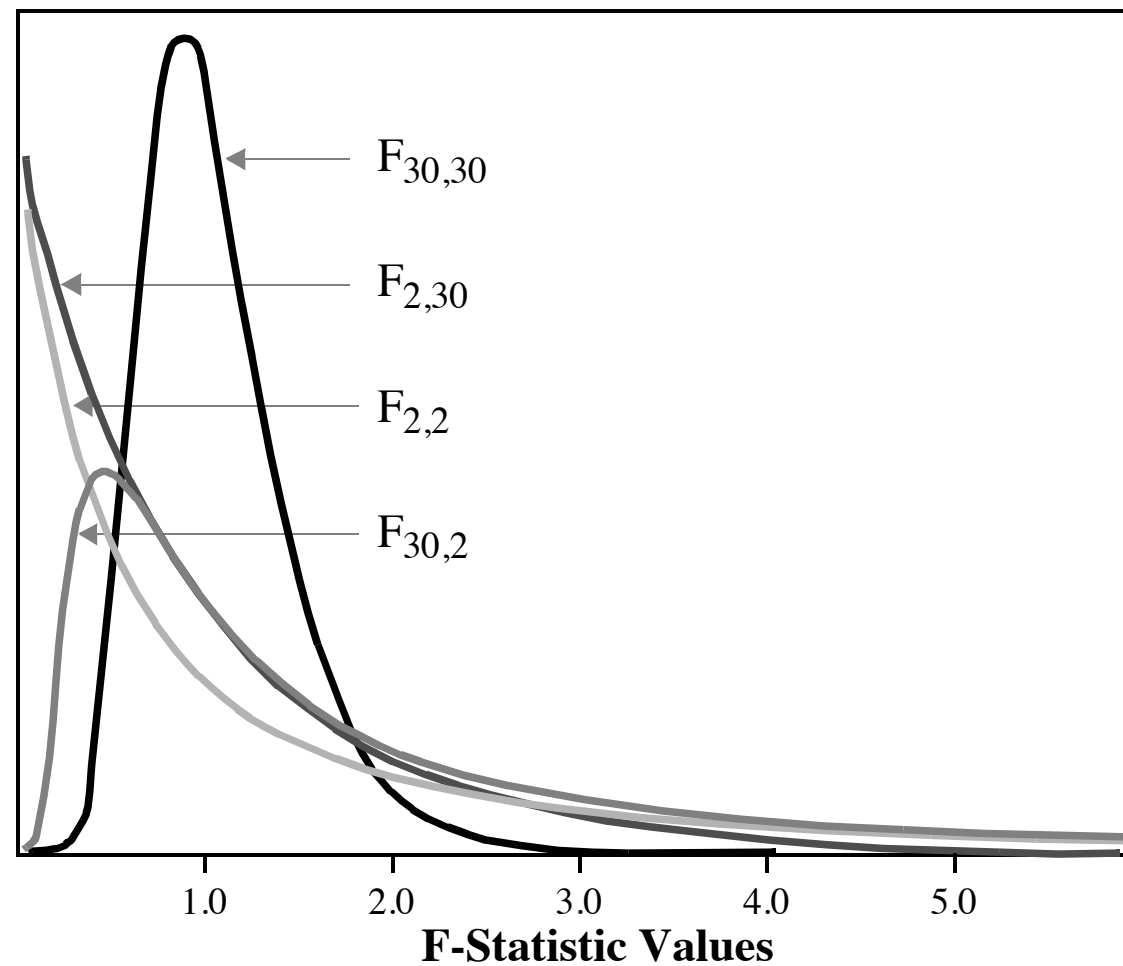
Display 5.9

p. 126

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Four F-distributions, having different degrees of freedom

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Large F stats give evidence against the null hypothesis.

We have convincing evidence that at least one judge has a different mean percentage of women on their venires (one-way Anova F test on 6 and 39 degrees of freedom, p-value = 0.00006).

# One way anova in R

```
anova(lm(Percent ~ Judge, data = case0502))
```

↑                    ↑  
response            groups

Analysis of Variance Table

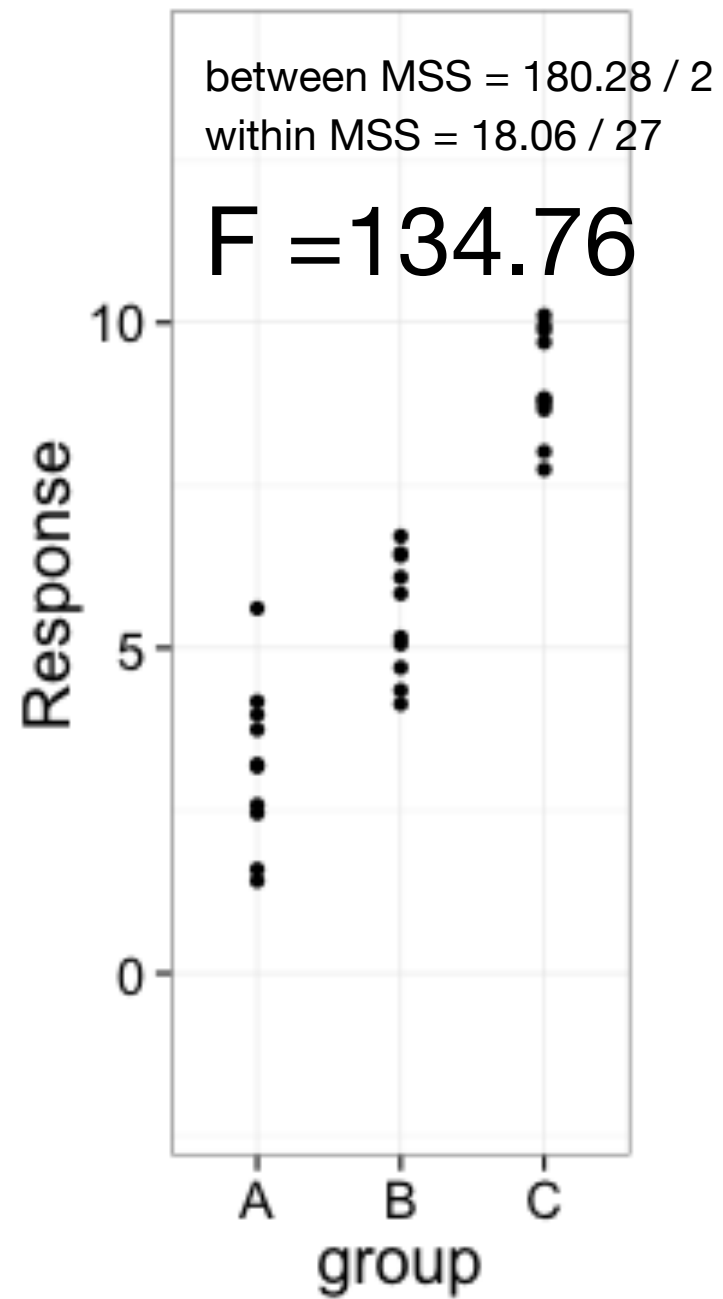
Response: Percent

|           | Df | Sum Sq | Mean Sq | F value | Pr(>F)        |
|-----------|----|--------|---------|---------|---------------|
| Judge     | 6  | 1927.1 | 321.18  | 6.7184  | 6.096e-05 *** |
| Residuals | 39 | 1864.5 | 47.81   |         |               |

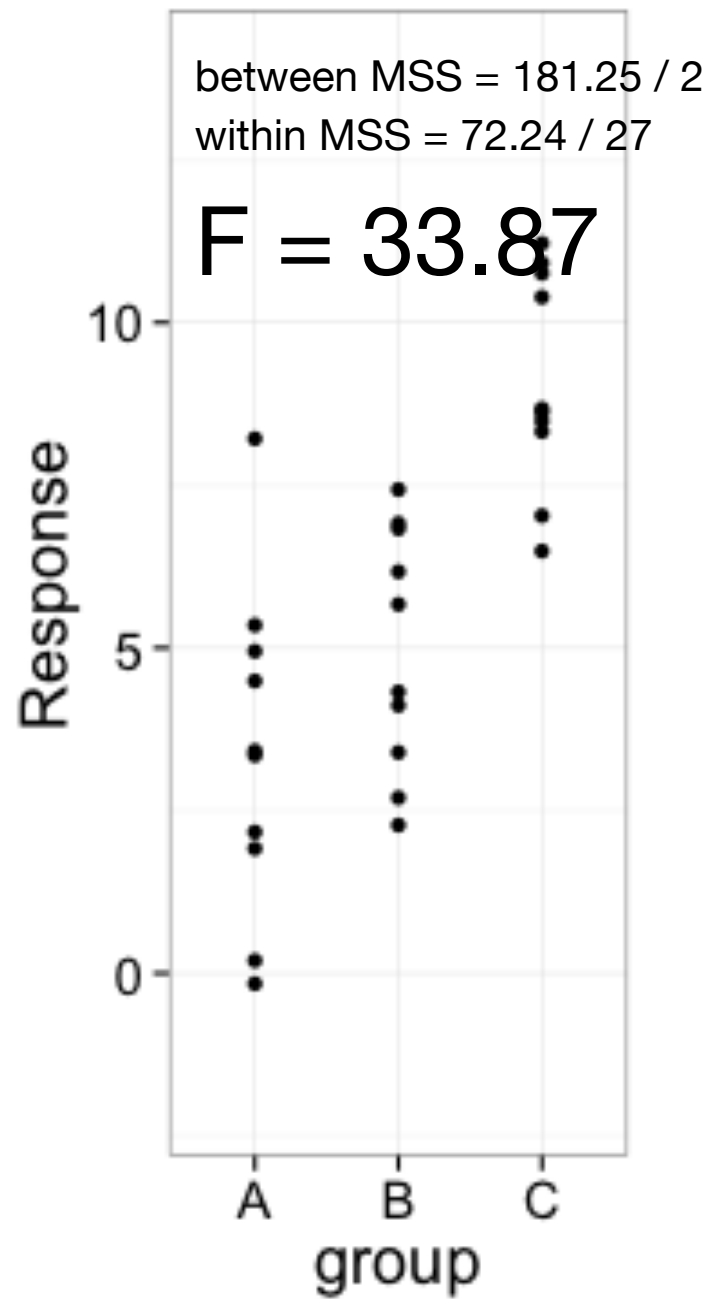
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Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

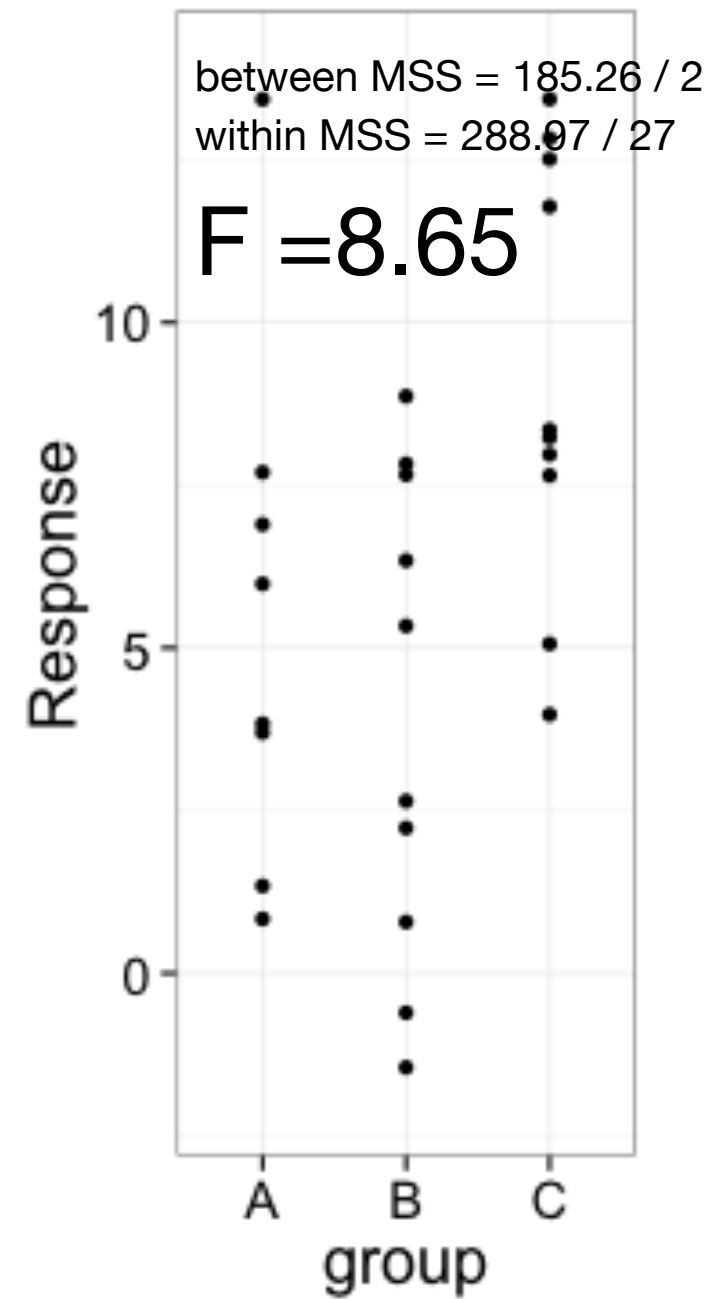
This will test the separate means model against the equal means model



$$p < 1 \times 10^{-14}$$



$$p < 1 \times 10^{-7}$$



$$p = 0.0012$$

Which would you say gives more evidence of the groups coming from populations with different means?

# Spock's trial

There is evidence that at least one judge has a different mean percent of women. a one-way anova conclusion

But what we really want to argue is that Spock's judge has a different mean percent of women compared to all the other judges.

We argue this in two steps:

**Argument #1.** There's no evidence the other judges (A-F) have different mean percentage of women from each other. That means it makes sense to imagine they are all drawing venires at random from a population with mean percentage of women,  $\mu_0$ .

**Argument #2.** There is evidence that Spock's judge has mean percentage of women that is not the same as the other judges, i.e. it is not,  $\mu_0$ .

These aren't one-way anova conclusions, we still use the extra SS F-test to reach them, but with different full and reduced models.



An extra Sums of Squares F-test  
compares **two models**

**Full model:** a model that fully  
describes the set of alternatives.

fit and find RSS and df

**Restricted model:** a restriction of the  
full model imposed by the null  
hypothesis.

fit and find RSS and df

# Extra SS F-statistic

$$F = \frac{\text{Extra Sum of Squares}}{\text{Extra degrees of freedom}}$$

$\hat{\sigma}^2_{\text{full}}$  ← squared pooled sd from full model  
find it from SS/df for full model

**Extra Sum of Squares =**

RSS from reduced model - RSS from full model =

reduction in residual sum of squares

**Extra degrees of freedom =**

df in reduced model - df in full model =

reduction in degrees of freedom

or how many **more**  
parameters does the  
full model have?

Under the **null** hypothesis (reduced model is true)  
the F-statistic has an F-distribution with  $v_1$  and  $v_2$   
degrees of freedom.

$v_1$  = extra df,  $v_2$  = df of full model

# Argument #1

**Null:** the population mean percentage of women is the same for all the **other** judges.

$$\mu_{\text{Spock}} = \mu_1, \quad \mu_A = \mu_B = \mu_C = \mu_D = \mu_E = \mu_F = \mu_0$$

**Alternative:** at least one “other” judge has a different mean.

**Full model:** separate means for all judges.

**Null model:** two means, one for Spock, one for everyone else.

```
> # create new Spock or Not variable
> case0502$two_groups <- ifelse(case0502$Judge == "Spock's", "Spock's", "Other")

> # find two group averages
> case0502$two_group_average <- with(case0502, ave(Percent, two_groups))

> # sum of squared residuals
> with(case0502, sum((Percent - two_group_average)^2))
[1] 2190.903
```

**Argument #1** Null: the population mean percentage of women is the same for all the **other** judges.

# ANOVA Table

|                      |                             | Sum of squared residuals | d.f. |
|----------------------|-----------------------------|--------------------------|------|
| <b>Full model</b>    | <b>separate means model</b> | 1864.46                  |      |
| <b>Reduced model</b> | <b>two means model</b>      | 2190.9                   |      |

n = 46

n - # parameters

**Argument #1** Null: the population mean percentage of women is the same for all the **other** judges.

## Your turn: Find the F-statistic

|                      |                             | Sum of squared residuals | d.f.                 | MSS              | F                | P-value                |
|----------------------|-----------------------------|--------------------------|----------------------|------------------|------------------|------------------------|
|                      | <b>Extra</b>                | C: subtract A from B     | F: subtract D from E | G: divide C by F | I: divide G by H | use R: 1 - pf(I, F, D) |
| <b>Full model</b>    | <b>separate means model</b> | A<br>1864.46             | D<br>39              | H: divide A by D |                  |                        |
| <b>Reduced model</b> | <b>two means model</b>      | B<br>2190.9              | E<br>44              |                  |                  |                        |

# Argument #1

We have evidence that any of the **other** six judges have a different mean percentage of women on their venires (extra sum of squares F-test on and degrees of freedom, p-value = ).

# Argument #2

**Null:** the population mean percentage of women for Spock is the same as the mean for all the other judges.

$$\mu_1 = \mu_0$$

**Reduced model:** there is **one** parameter, the mean for everyone. equal means model

**Full model:** there are **two** parameters, the mean for Spock's judge, the mean of all the other judges.

two means model



**Argument #2** the population mean percentage of women for Spock is the same as the mean for all the other judges

# ANOVA Table

|                      |                   | Sum of squared residuals | d.f.      |
|----------------------|-------------------|--------------------------|-----------|
| <b>Full model</b>    | two means model   | <b>2190.9</b>            | <b>44</b> |
| <b>Reduced model</b> | equal means model | <b>3791.53</b>           | <b>45</b> |

**Argument #2** the population mean percentage of women for Spock is the same as the mean for all the other judges

|                      |                   | Sum of squared residuals | d.f.                 | MSS              | F                | P-value |
|----------------------|-------------------|--------------------------|----------------------|------------------|------------------|---------|
|                      | what's left?      | C: subtract A from B     | F: subtract D from E | G: divide C by F | I: divide G by H | <0.0001 |
| <b>Full model</b>    | two means model   | <b>2190.9</b>            | <b>44</b>            | H: divide A by D |                  |         |
| <b>Reduced model</b> | equal means model | <b>3791.53</b>           | <b>45</b>            |                  |                  |         |

# Argument #2

We have evidence that Spock's judge has a different mean percentage of women on his venires than all the other judges (extra sum of squares F-test on and degrees of freedom, p-value = ).

## Anova in R

To test the full model against another model

```
> # full model
> m1 <- lm(Percent ~ Judge, data = case0502)
> # all other judges equal
> m2 <- lm(Percent ~ two_groups, data = case0502)
> # gives the anova table for two means versus full model
> anova(m1, m2)
```

A variable I made



Analysis of Variance Table

```
Model 1: Percent ~ Judge
Model 2: Percent ~ two_groups
  Res.Df  RSS Df Sum of Sq    F Pr(>F)
1     39 1864.5
2     44 2190.9 -5   -326.46 1.3658 0.2582
```