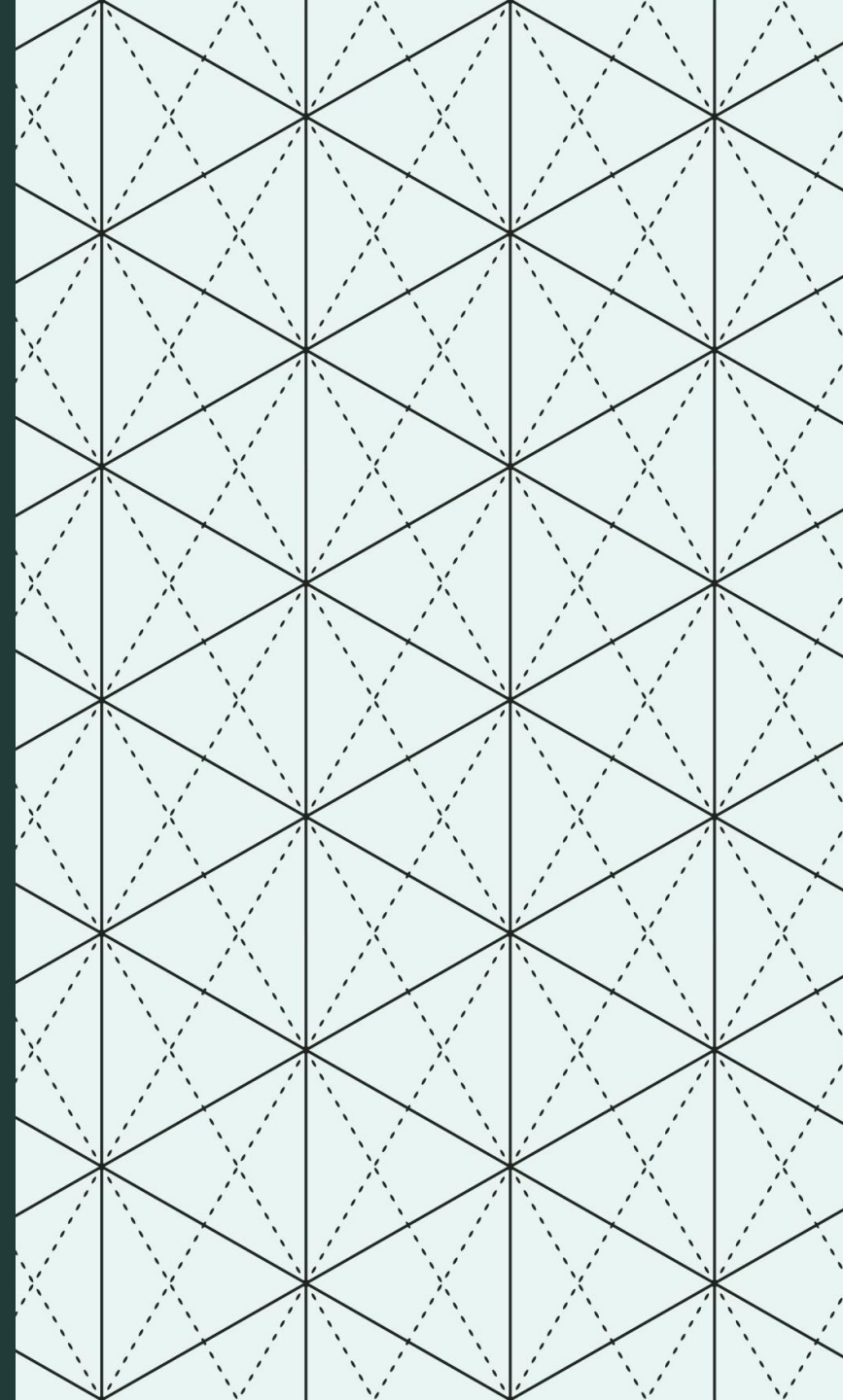


---

# WELCOME TO PSY 653 LAB!

MODULE 06: REPEATED MEASURES AND MIXED  
DESIGNS

\*Thanks to Gemma Wallace for her help with these slides



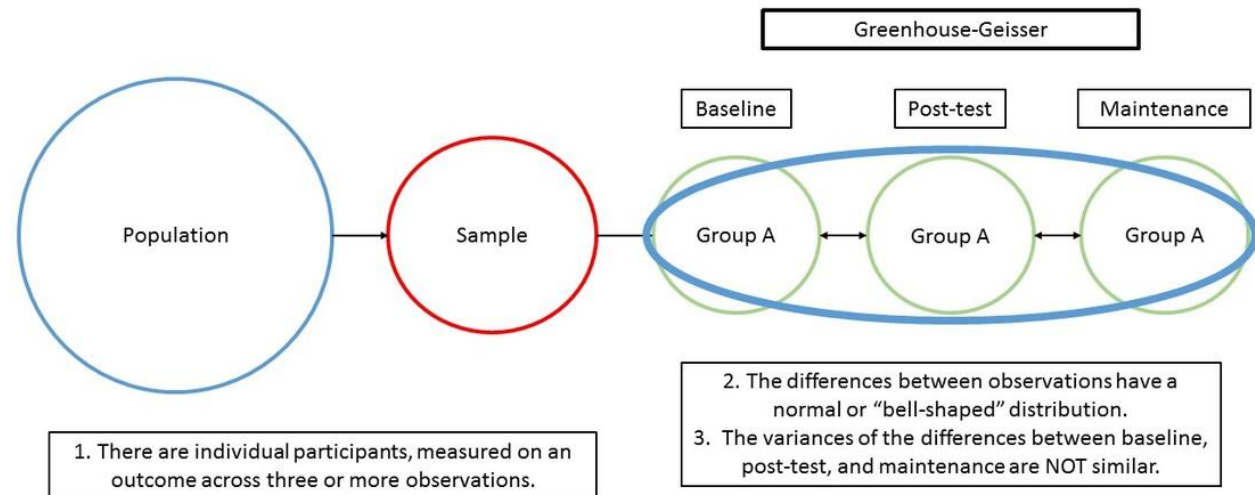
# KEY TERMS

## × Repeated Measures

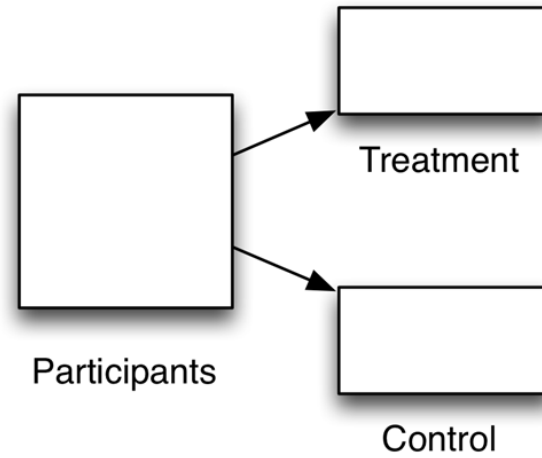
- + When subjects participate in all conditions of an experiment or provide data at multiple timepoints

## × Sphericity

- + Equality of variances of the *differences* between treatment levels

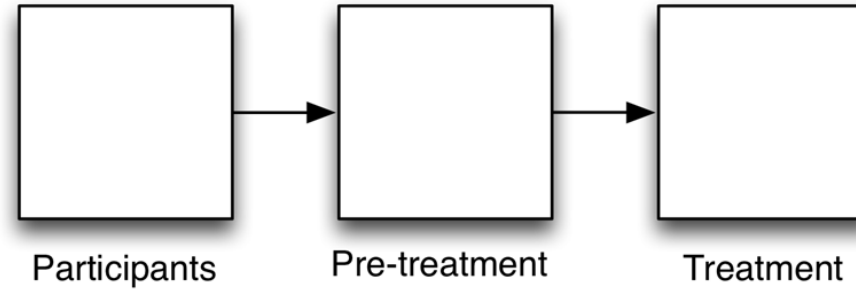


Between-subjects  
design



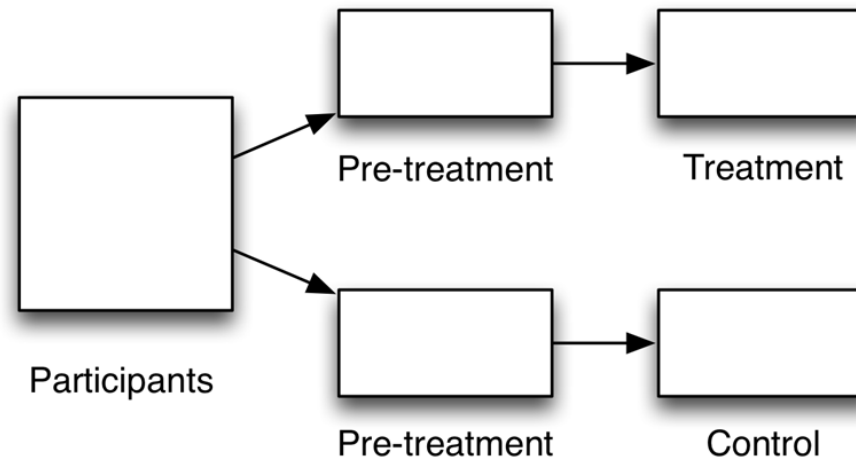
Compares  
treatment  
and  
control

Within-subjects  
design



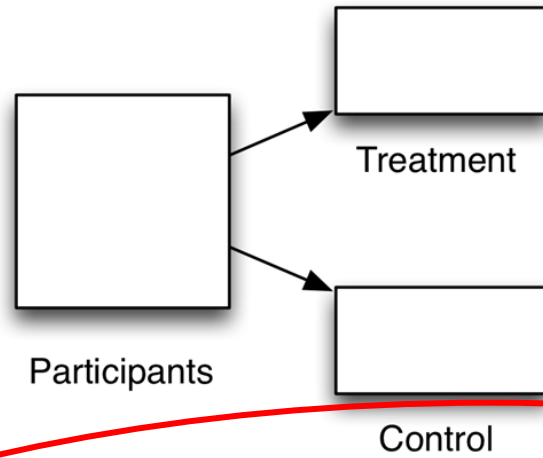
Compares  
pre-treatment  
and  
treatment

Mixed  
design



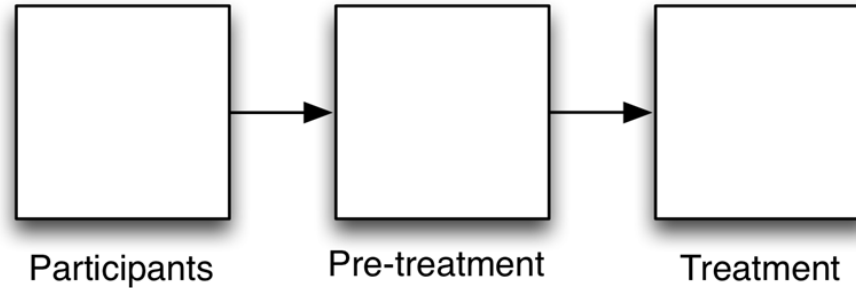
Compares  
change in  
treatment group  
and  
change in  
control group

Between-subjects  
design



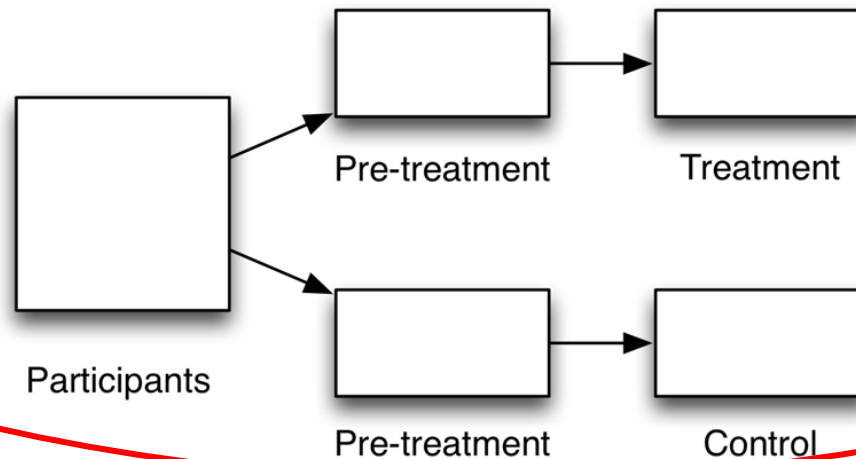
Compares  
treatment  
and  
control

Within-subjects  
design



Compares  
pre-treatment  
and  
treatment

Mixed  
design



Compares  
change in  
treatment group  
and  
change in  
control group

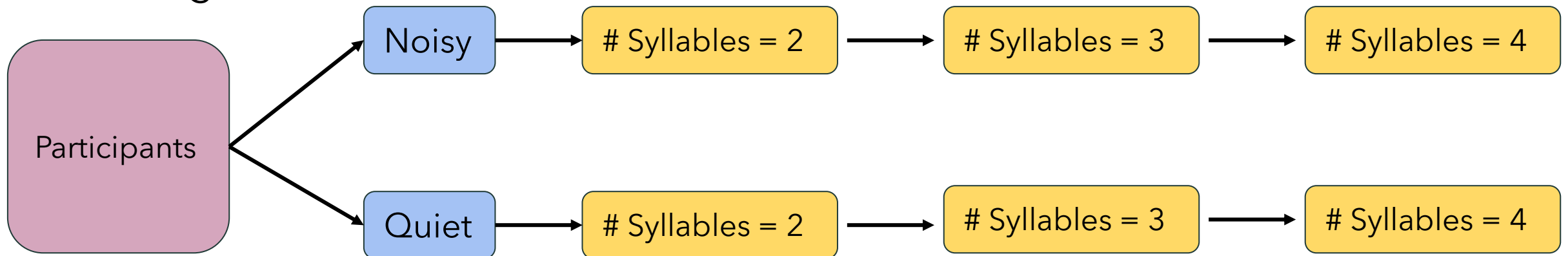
# CLASS EXAMPLE

A researcher is interested in the length of time it takes to say 2 syllable, 3 syllable, and 4 syllable words. She first times how long it takes each participant to say the 2 syllable word, then the 3 syllable word, then the 4 syllable word. However, half the participants are put in a condition in which there is a distracting noise in the background. She is interested if there is a difference between the control condition and the noise condition.

# OUR VARIABLES AND RESEARCH DESIGN

- Noise Condition = between-subjects factor
  - Every participant is only exposed to one condition, either control or noisy
- # of syllables = within-subjects factor
  - Every participant reads words of all three syllable lengths
- Length of time to say each word = outcome variable

Mixed design





---

# CREATE A NEW R-PROJECT AND R-NOTEBOOK!

Download the “syllables.csv” file  
from Canvas and save it into your  
R-project file

# LOAD LIBRARIES

```
# Load libraries
```{r}
install.packages("ez")

library(tidyverse)
library(ez)
library(psych)
```
```





# READ IN THE DATA

```
13 # Read in data
14 {r}
15 syl <- read_csv("syllables.csv")
16
```

```
Parsed with column specification:
cols(
  ID = col_double(),
  length = col_double(),
  cond = col_double(),
  time = col_double()
)
```

17

- × ID = subject id
- × length = # of syllables in word (2, 3, or 4)
- × cond = condition (0 = control, 1 = noise condition)
- × time = milliseconds it took to say the word (outcome variable)

# DESCRIBE THE DATASET

```
19 {r}  
20 describe(syl)  
21
```

|        | vars<br><dbl> | n<br><dbl> | mean<br><dbl> | sd<br><dbl> | median<br><dbl> | trimmed<br><dbl> | mad<br><dbl> | min<br><dbl> | max<br><dbl> |
|--------|---------------|------------|---------------|-------------|-----------------|------------------|--------------|--------------|--------------|
| ID     | 1             | 48         | 8.50          | 4.66        | 8.5             | 8.5              | 5.93         | 1            | 16           |
| length | 2             | 48         | 3.00          | 0.83        | 3.0             | 3.0              | 1.48         | 2            | 4            |
| cond   | 3             | 48         | 0.50          | 0.51        | 0.5             | 0.5              | 0.74         | 0            | 1            |
| time   | 4             | 48         | 519.67        | 54.52       | 519.0           | 519.3            | 50.41        | 402          | 641          |

4 rows | 1-10 of 13 columns

# FACTOR THE PREDICTOR VARIABLES

```
18 # Factor variables
19 ```{r}
20 syl <- mutate(syl,
21               ID.f    = as.factor(ID),
22               cond.f   = factor(cond,
23                                 levels = c(0,1),
24                                 labels = c("Quiet", "Noisy")),
25               length.f = factor(length,
26                                 levels = c(2,3,4),
27                                 labels = c("2 syl", "3 syl", "4 syl"))
28             )
29 ...
```

\*Note: ezANOVA() (The main function we'll be using today) will do this automatically, but it's nice to remove the warning message and it looks nicer!

## THE ezANOVA() FUNCTION

```
ezANOVA(data = dataframe,  
        dv = outcome_variable,  
        wid = variable_that_identifies_participants,  
        within = repeated_measures_predictors,  
        between = between_group_predictors,  
        detailed = TRUE,  
        type = 3)
```

If there are multiple predictor variables for each category, use a ".", parentheses, and separate them with a comma e.g., .(x,y). Use ?ezANOVA for more information

---

# **ANALYSES 1:**

## RESEARCH QUESTION

Does length of time to read each word significantly differ by word syllable length?  
(We are ignoring Condition for analyses 1)

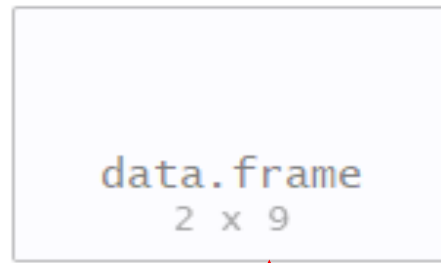
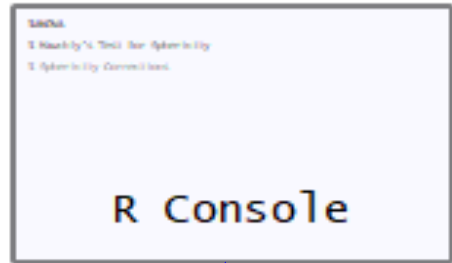
## ANALYSIS 1: RUN A REPEATED MEASURES ANOVA (IGNORING CONDITION FOR NOW)

```
32 ▾ # Repeated measures ANOVA
33 ▾ ```{r}
34 ezANOVA(
35     data = syl,
36     dv = time,
37     wid = ID.f,
38     within = length.f,
39     detailed = TRUE,
40     type = 3
41 )
42 ▴ ```
```

```
32 ▾ # Repeated measures ANOVA
33 ▾ ```{r}
34 ezANOVA(
35     data = syl,
36     dv = time,
37     wid = ID.f,
38     within = length.f,
39     detailed = TRUE,
40     type = 3
41 )
42 ▴ ```
```

- × data = dataset
- × dv = dependent variable
- × wid = ID grouping variable (factored)
- × within = within subject variable (factored)
- × "detailed = TRUE" indicates we want detailed output
- × "type = 3" indicates we would like it to perform a type 3 ANOVA

# 4 WINDOWS WILL BE OUTPUTTED!



`$ANOVA`

`$`Mauchly's Test for Sphericity``

`$`Sphericity Corrections``

R console  
(Errors will be reported  
here)

ANOVA table

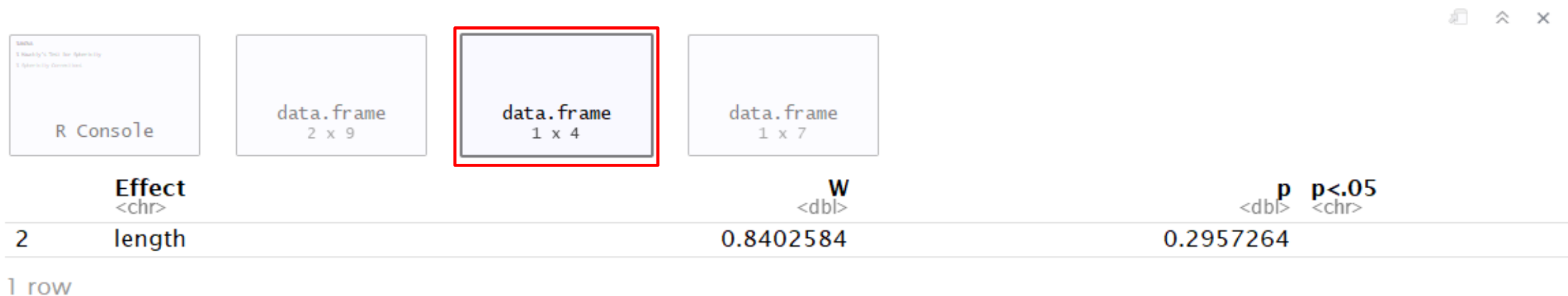
Sphericity test

Greenhouse-Geisser & Huynh-Feldt  
corrections (Use if sphericity is  
violated)



# FIRST, CHECK IF SPHERICITY IS VIOLATED

Sphericity = the variances of the differences between all possible pairs of within-subject conditions (i.e., levels of the categorical predictor) are equal



| Effect | length | W         | p         | p<.05 |
|--------|--------|-----------|-----------|-------|
| <chr>  |        | <dbl>     | <dbl>     | <chr> |
| 2      |        | 0.8402584 | 0.2957264 |       |

1 row

A non-significant  $p$  value (i.e.,  $>0.05$ ) means that the condition of sphericity has been met. We do NOT need to use the Greenhouse-Geisser & Huynh-Feldt corrections (Window 4)

# CHECK IF SPHERICITY IS VIOLATED

data

1. Mauchly's Test for Sphericity

1. Sphericity Assumption

R Console

data.frame

2 x 9

data.frame

1 x 4

data.frame

1 x 7

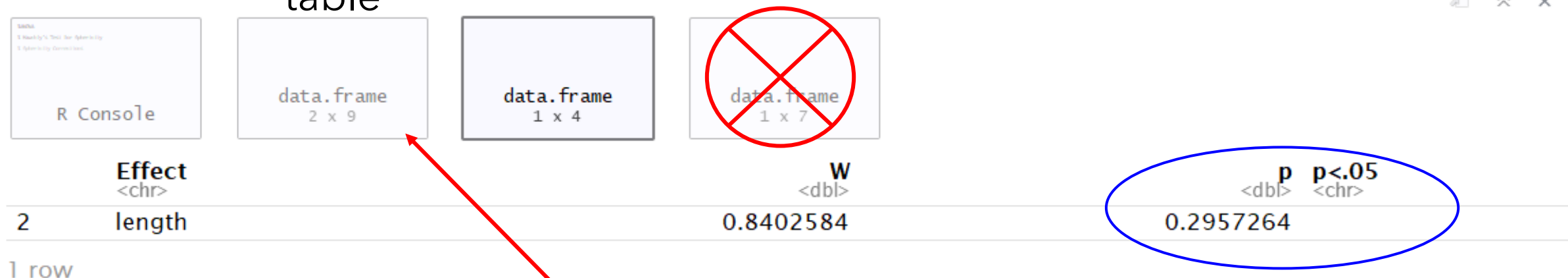
|   | Effect<br><chr> |  | W<br><dbl> |  | p<br><dbl> | p<.05<br><chr> |
|---|-----------------|--|------------|--|------------|----------------|
| 2 | length          |  | 0.8402584  |  | 0.2957264  |                |

1 row

Was it violated?

# CHECK IF SPHERICITY IS VIOLATED

ANOVA  
table



|   | Effect<br><chr> | W<br><dbl> | p<br><dbl> | p<.05<br><chr> |
|---|-----------------|------------|------------|----------------|
| 2 | length          | 0.8402584  | 0.2957264  |                |

1 row

Was it violated?

**NO!**

(therefore we don't need to deal with window 4)

NEXT, VIEW THE ANOVA TABLE (SINCE SPHERICITY WASN'T VIOLATED)

R Console

data.frame  
2 x 9

data.frame  
1 x 4

data.frame  
1 x 7

| Effect        | DFn   | DFd   | SSn          | SSd        | F          | p            | p<.05 | ges        |
|---------------|-------|-------|--------------|------------|------------|--------------|-------|------------|
| <chr>         | <dbl> | <dbl> | <dbl>        | <dbl>      | <dbl>      | <dbl>        | <chr> | <dbl>      |
| 1 (Intercept) | 1     | 15    | 12962565.333 | 133137.333 | 1460.43544 | 2.303569e-16 | *     | 0.98953873 |
| 2 length      | 2     | 30    | 2688.167     | 3901.167   | 10.33601   | 3.848535e-04 | *     | 0.01923875 |

2 rows



```
### Visualize the effect
```

```
{r}
```

```
syl_sum <- group_by(syl, length.f)
```

```
syl_sum <- summarise(syl_sum, time = mean(time))
```

```
syl_sum <- ungroup(syl_sum)
```

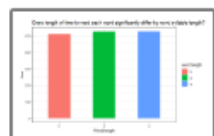
```
ggplot(syl_sum, aes(x = length.f, y = time, group = length.f, fill = length.f)) +
```

```
  geom_col(width = .5) +
```

```
  theme_bw() +
```

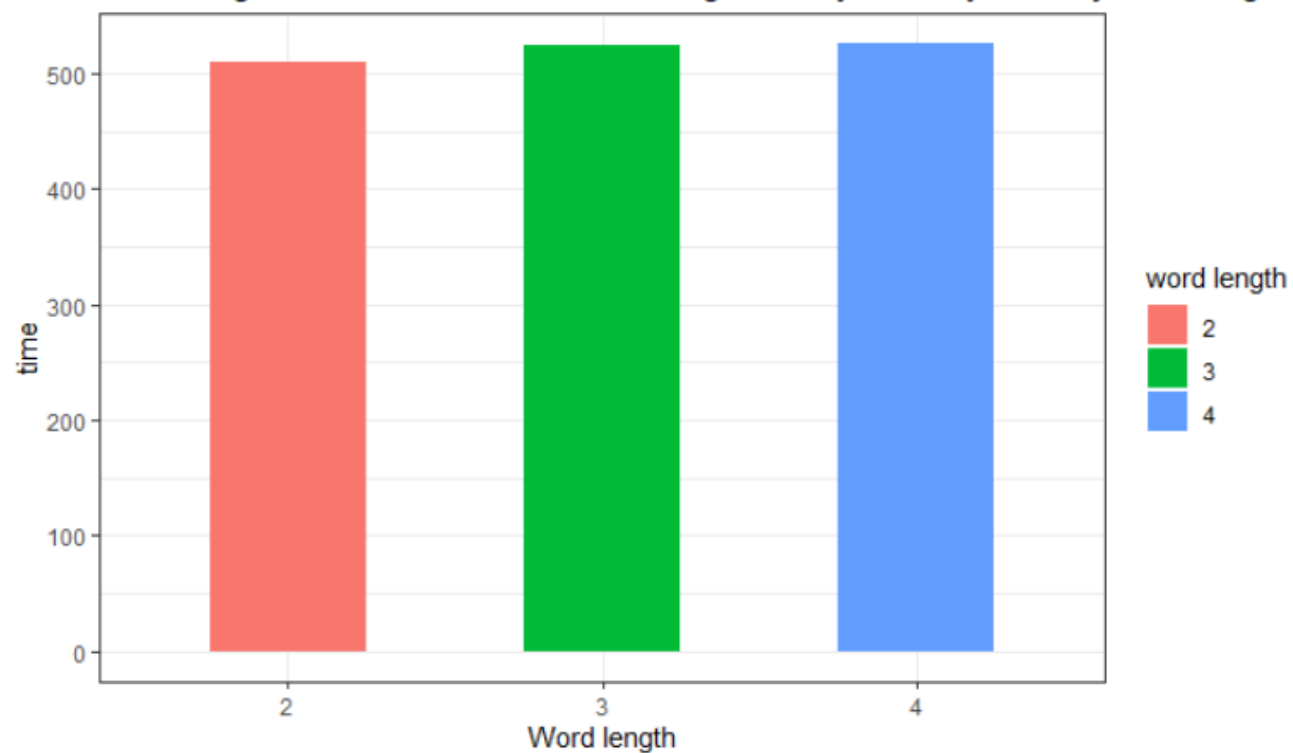
```
  labs(title = "Does length of time to read each word significantly differ by word syllable length?", fill = "word length",  
        x = "Word length")
```

```
...
```



R Console

Does length of time to read each word significantly differ by word syllable length?



---

## **ANALYSIS 2:**

RUN A MIXED EFFECTS ANOVA TO EVALUATE EFFECTS OF BOTH #  
OF SYLLABLES AND NOISE CONDITION ON TIME

Does length of time to read each word significantly  
differ by word syllable length AND by condition?

## ANALYSIS 2: RUN A MIXED EFFECTS ANOVA TO EVALUATE EFFECTS OF BOTH # OF SYLLABLES AND NOISE CONDITION ON TIME

```
58 - ## Mixed design
59 - ```{r}
60 ezANOVA(
61     data=syl,
62     dv=time,
63     wid=ID,
64     within= length,
65     between = cond,
66     detailed=TRUE,
67     type = 3
68 )
69 ...
```

# FIRST, CHECK IF SPHERICITY WAS VIOLATED

R Console

data.frame  
4 x 9

data.frame  
2 x 4

data.frame  
2 x 7

|   | Effect<br><chr> | W<br><dbl> | p<br><dbl> | p<.05<br><chr> |
|---|-----------------|------------|------------|----------------|
| 3 | length          | 0.8953253  | 0.4873887  |                |
| 4 | cond:length     | 0.8953253  | 0.4873887  |                |

2 rows



# FIRST, CHECK IF SPHERICITY WAS VIOLATED

| <div><div>R Console</div><div>data.frame<br/>4 x 9</div><div>data.frame<br/>2 x 4</div><div><div>data.frame<br/>2 x 7</div></div></div> |                 |  |            |            |                |
|---|-----------------|--|------------|------------|----------------|
|   | Effect<br><chr> |  | W<br><dbl> | p<br><dbl> | p<.05<br><chr> |
| 3   | length          |  | 0.8953253  | 0.4873887  |                |
| 4   | cond:length     |  | 0.8953253  | 0.4873887  |                |
| 2 rows  |                 |  |            |            |                |

Sphereicity was NOT violated ( $p > .05$ )

NEXT, VIEW THE ANOVA TABLE (SINCE SPHERICITY WASN'T VIOLATED)

R Console

data.frame  
4 x 9

data.frame  
2 x 4

data.frame  
2 x 7

| Effect                     | DFn                        | DFd                        | SSn                        | SSd                        | F                          | p                          | p<.05                      | ges                        |
|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|
| <small>&lt;chr&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;dbl&gt;</small> | <small>&lt;chr&gt;</small> | <small>&lt;dbl&gt;</small> |
| 1 (Intercept)              | 1                          | 14                         | 1.296257e+07               | 132976                     | 1.364727e+03               | 2.342147e-15               | *                          | 0.989620054                |
| 2 cond                     | 1                          | 14                         | 1.613333e+02               | 132976                     | 1.698552e-02               | 8.981607e-01               |                            | 0.001185200                |
| 3 length                   | 2                          | 28                         | 2.688167e+03               | 2986                       | 1.260359e+01               | 1.249189e-04               | *                          | 0.019388124                |
| 4 cond:length              | 2                          | 28                         | 9.151667e+02               | 2986                       | 4.290802e+00               | 2.368832e-02               | *                          | 0.006686043                |

4 rows

SSd = an error term: the amount of unexplained variance across the conditions of the within-subjects variable

```
84 # Visualize the effect
```

```
85 ```{r}
```

```
86
```

```
87
```

```
88 syl_sum <- group_by(syl, cond.f, length.f)
```

```
89 syl_sum <- summarise(syl_sum, time = mean(time))
```

```
90 syl_sum <- ungroup(syl_sum)
```

```
91
```

```
92
```

```
93
```

```
94 ggplot(syl_sum, aes(x = length.f, y = time, color = cond.f)) +
```

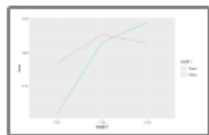
```
95   geom_line(aes(group = cond.f))
```

```
96
```

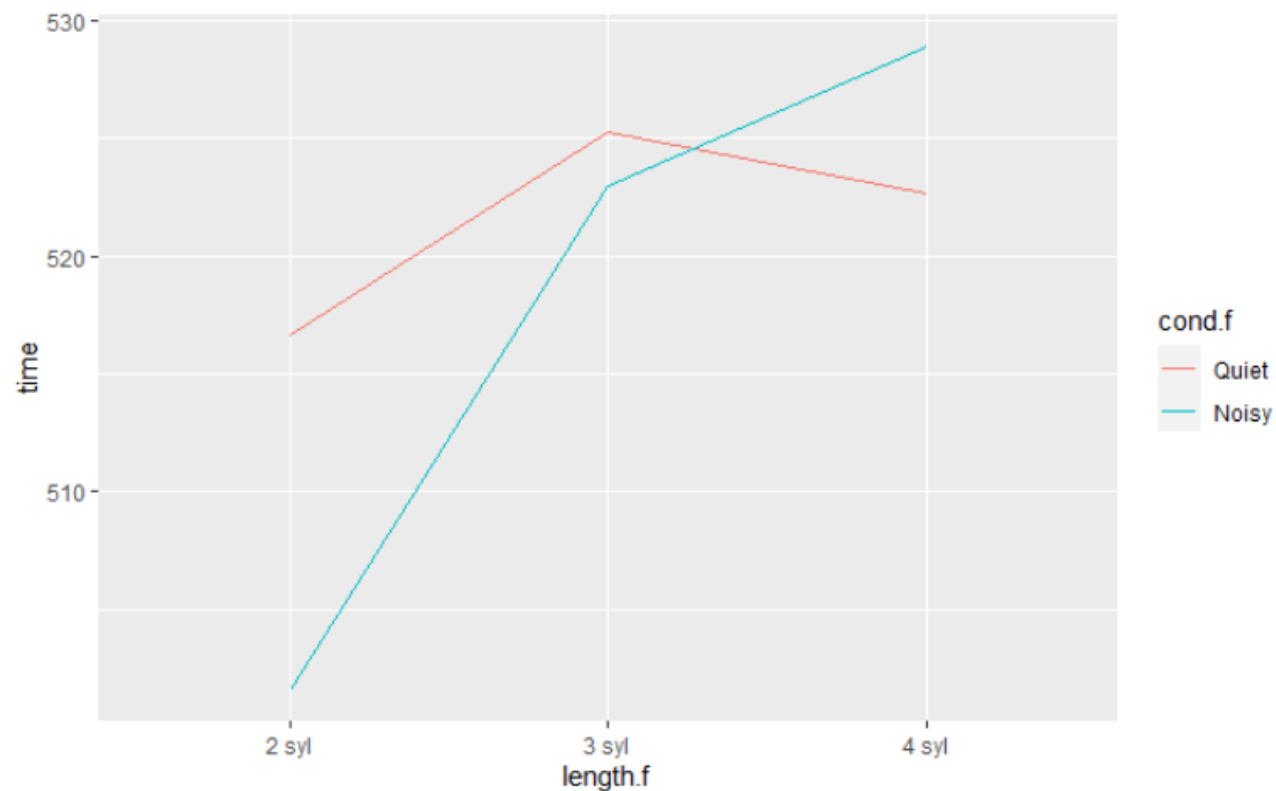
```
97
```

```
98
```

```
99 ```
```



R Console



VISUALIZE THE  
EFFECTS OF SYLLABLE  
LENGTH AND NOISE  
CONDITION ON TIME  
TO SAY EACH WORD

---

## WHAT SHOULD YOU DO IF THE SPHERICITY ASSUMPTION IS VIOLATED?

We didn't violate the assumption in this demo activity, but if we had:

- × Use the output from Window 4 and apply a correction to the model F Ratio, and then use that value in your model interpretations.