

WELCOME!

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# GETTING STARTED



Install the janitor package from GitHub:  
`devtools::install_github("sfirke/janitor")`

CHRISTOPHER PRENER, PH.D.  
FALL, 2017

WEEK 16  
LECTURE 17

## QUANTITATIVE ANALYSIS

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# CHI-SQUARE

# AGENDA

1. Front Matter
2. Chi-square Test Theory
3. Contingency Tables in R
4. Chi-square in R
5. Back Matter

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# FRONT MATTER

## 1. FRONT MATTER

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# ANNOUNCEMENTS



Lab-16 and **all final project** materials are due by next Monday (12/18) at 4:00pm



Final project submissions on GitHub should include code and pdfs of handout, slides, and (if necessary) your paper.



Final grades available by end of business on Wednesday, 12/20



We have not hit the required response rate for course evals!

# 2 CHI-SQUARE TEST THEORY

## 2. CHI-SQUARE TEST THEORY

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**IT'S BEEN ALL ABOUT THE MEAN**

$$\bar{x} = \frac{\sum_{i=1}^n x}{n}$$

$$s = \sqrt{\frac{\sum_{i=1}^n (x - \bar{x})^2}{n - 1}}$$

## 2. CHI-SQUARE TEST THEORY

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IT'S BEEN ALL ABOUT THE MEAN

$$\bar{x} = \frac{\sum_{i=1}^n x}{n}$$

$$t = \frac{\bar{X}_a - \bar{X}_b}{\sqrt{\frac{s_p^2}{n_a} + \frac{s_p^2}{n_b}}}$$



## 2. CHI-SQUARE TEST THEORY

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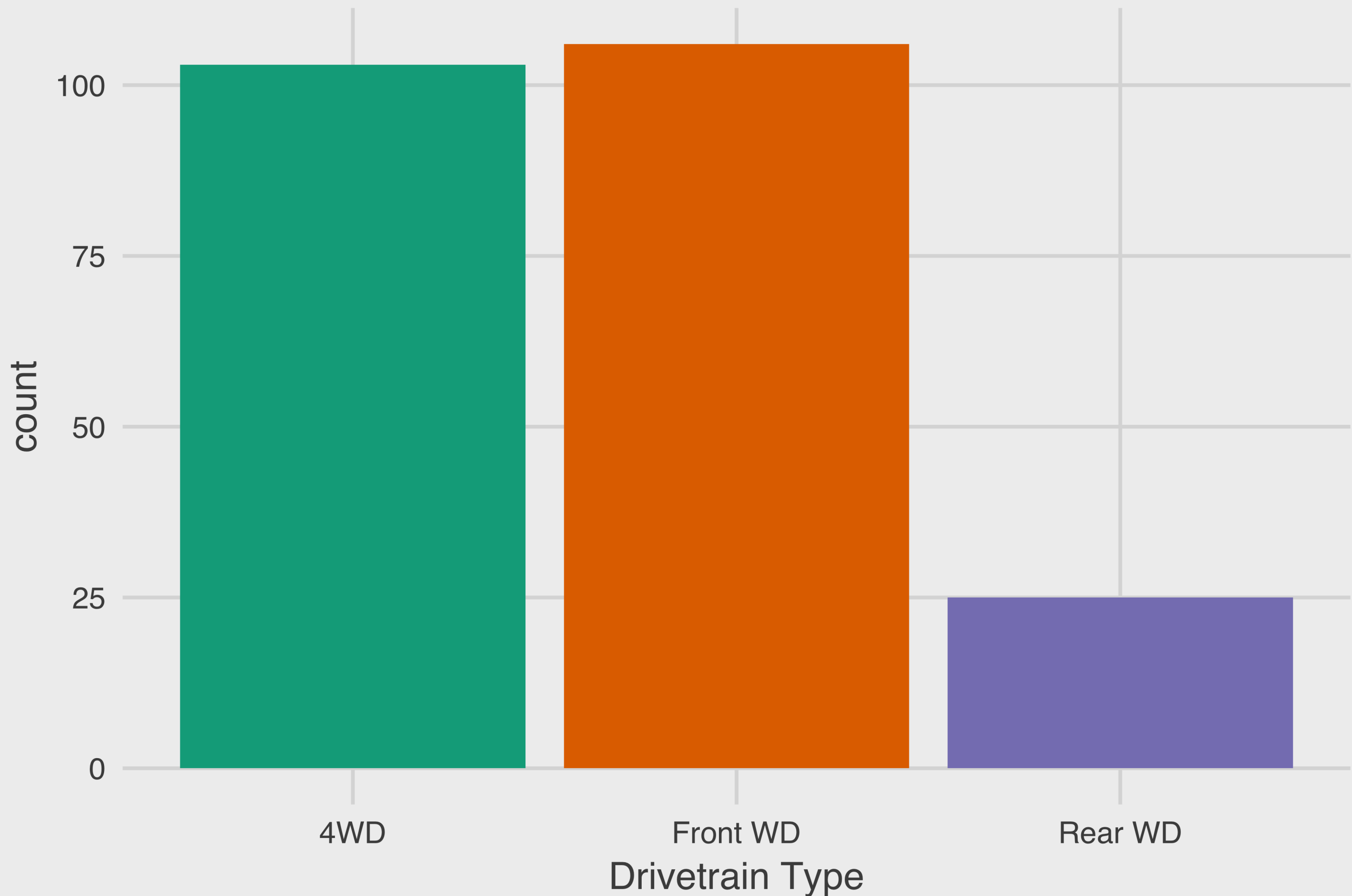
IT'S BEEN ALL ABOUT THE MEAN

$$\bar{x} = \frac{\sum_{i=1}^n x}{n}$$

$$r = \frac{\sum_{i=1}^n (x - \bar{x})(y - \bar{y})}{(n - 1)s_x s_y}$$

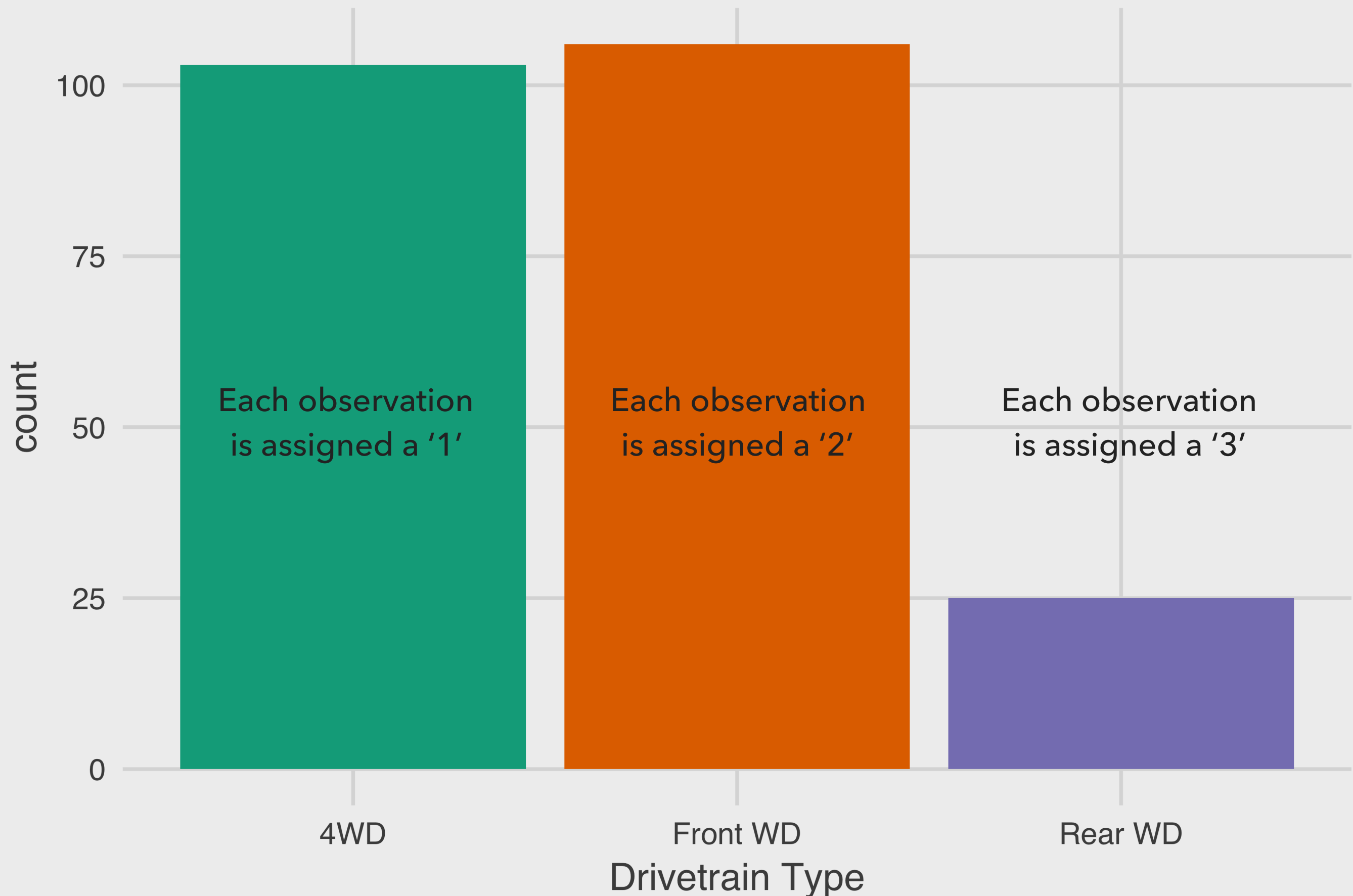
# Drivetrain Variable from ggplot2's mpg Data

Original factor with mean of 1.667



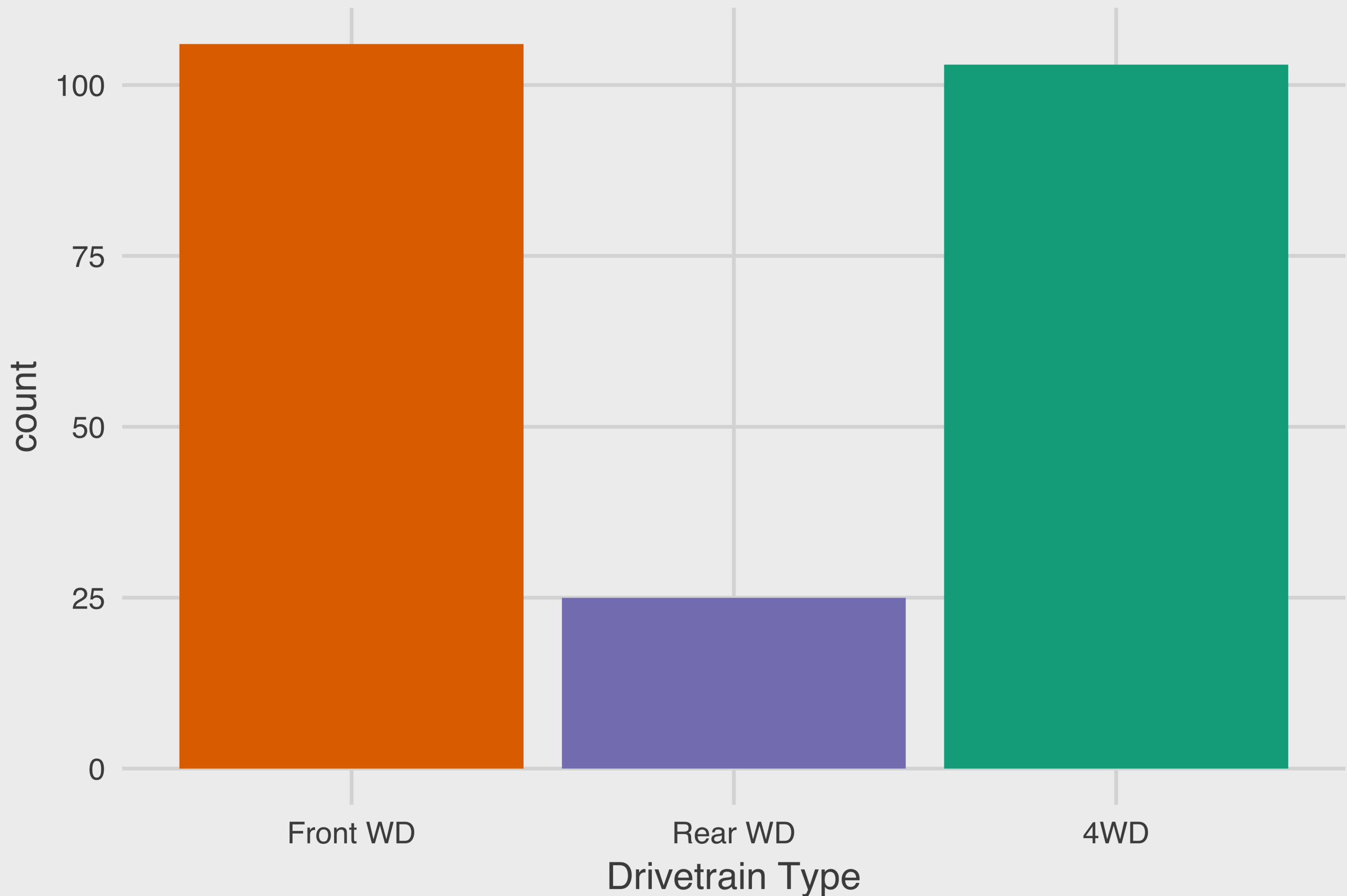
# Drivetrain Variable from ggplot2's mpg Data

Original factor with mean of 1.667



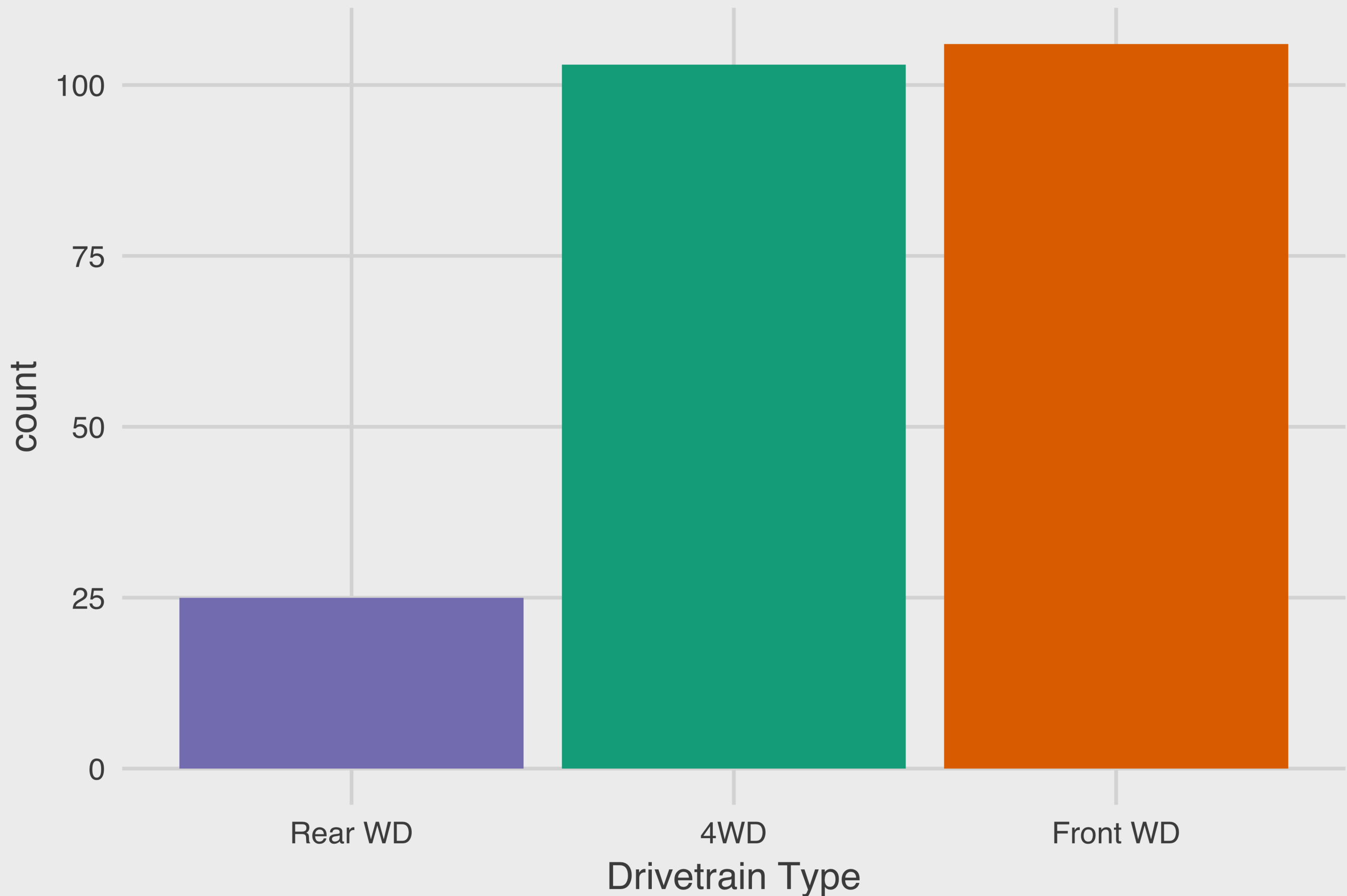
# Drivetrain Variable from ggplot2's mpg Data

Re-leveled factor with mean of 1.987



# Drivetrain Variable from ggplot2's mpg Data

Re-leveled factor with mean of 2.346



# 3 CONTINGENCY TABLES IN R

### 3. CONTINGENCY TABLES IN R

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# ONE-WAY TABLES IN R



`tabyl(.data, varName)`

Parameters:

▶ `.data`

▶ `varName`  
character



Available in `janitor`

Download via [GitHub](#) (for now)

, or

### 3. CONTINGENCY TABLES IN R

---

# ONE-WAY TABLES IN R



`tabyl(.data, varName)`

Parameters:

- ▶ `.data` is a data frame or table (can be used in a pipe)
- ▶ `varName` is the variable name you want to analyze (numeric, factor, or character)



# ONE-WAY TABLES IN R



`tabyl(.data, varName)`



Using the `cyl` variable from ggplot2's mpg data:

```
> tabyl(mpg, cyl)
  cyl  n    percent
  4 81 0.34615385
  5  4 0.01709402
  6 79 0.33760684
  8 70 0.29914530
```

# ONE-WAY TABLES IN R



`tabyl(.data, varName)`



Using the `cyl` variable from `ggplot2`'s `mpg` data in a pipe:

```
> mpg %>%  
+   tabyl(cyl)  
  cyl  n    percent  
    4 81 0.34615385  
    5  4 0.01709402  
    6 79 0.33760684  
    8 70 0.29914530
```

### 3. CONTINGENCY TABLES IN R

---

# TWO-WAY TABLES IN R



`tabyl(.data, xvar, yvar)`

Parameters:

- ▶ `.data` is a data frame or table (can be used in a pipe)
- ▶ `xvar` is the variable name of the first variable you want to analyze (numeric, factor, or character)
- ▶ `yvar` is the variable name of the second variable you want to analyze (numeric, factor, or character)

# TWO-WAY TABLES IN R



`tabyl(.data, xvar, yvar)`



Using the `cyl` and `drv` variables from ggplot2's mpg data:

```
> tabyl(mpg, cyl, drv)
```

cyl	4	f	r
4	23	58	0
5	0	4	0
6	32	43	4
8	48	1	21

# ADDING TOTALS



`adorn_totals`(where = *position*)

Parameters:

- ▶ `position` is one of ‘row’ (for row totals), ‘col’ (for column totals), or both combined together with the concatenate function.

# ADDING TOTALS



`adorn_totals(where = position)`



Using the `cyl` and `drv` variables from `ggplot2`'s `mpg` data:

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = "row")
```



Should be used in a pipeline after the `tabyl()` function but before any other adornment functions!

### 3. CONTINGENCY TABLES IN R

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# ADDING TOTALS

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = "row")
```

cyl	4	f	r
4	23	58	0
5	0	4	0
6	32	43	4
8	48	1	21
Total	103	106	25

### 3. CONTINGENCY TABLES IN R

---

# ADDING TOTALS

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = "col")
```

cyl	4	f	r	Total
4	23	58	0	81
5	0	4	0	4
6	32	43	4	79
8	48	1	21	70



### 3. CONTINGENCY TABLES IN R

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# ADDING TOTALS

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col"))
```

cyl	4	f	r	Total
4	23	58	0	81
5	0	4	0	4
6	32	43	4	79
8	48	1	21	70
Total	103	106	25	234

# ADDING PERCENTAGES



`adorn_percentages`(denominator = *pctType*)

Parameters:

- ▶ `pctType` is one of “row” (for row percents), “col” (for column percents), or “all” (for all percentages).

# ADDING PERCENTAGES



`adorn_percentages(denominator = pctType)`



Using the `cyl` and `drv` variables from `ggplot2`'s `mpg` data:

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages(denominator = "row")
```



Should be used in a pipeline after the `tabyl()` function and `adorn_totals()` (if used)!

### 3. CONTINGENCY TABLES IN R

---

# ADDING PERCENTAGES

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages(denominator = "row")
```

cyl	4	f	r	Total
4	0.2839506	0.71604938	0.000000000	1
5	0.00000000	1.000000000	0.000000000	1
6	0.4050633	0.54430380	0.05063291	1
8	0.6857143	0.01428571	0.300000000	1
Total	0.4401709	0.45299145	0.10683761	1

# FORMATTING PERCENTAGES



`adorn_pct_formatting(digits = val)`

Parameters:

- ▶ `val` is the number of significant digits you want your percentage values rounded to.

# FORMATTING PERCENTAGES



`adorn_pct_formatting(digits = val)`



Using the `cyl` and `drv` variables from `ggplot2`'s `mpg` data:

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages(denominator = "row") %>%  
+   adorn_pct_formatting(digits = 3)
```



Should be used in a pipeline after the `tabyl()` function and `adorn_totals()` (if used)!

### 3. CONTINGENCY TABLES IN R

---

# ADDING PERCENTAGES

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages(denominator = "row") %>%  
+   adorn_pct_formatting(digits = 3)
```

cyl	4	f	r	Total
4	28.395%	71.605%	0.000%	100.000%
5	0.000%	100.000%	0.000%	100.000%
6	40.506%	54.430%	5.063%	100.000%
8	68.571%	1.429%	30.000%	100.000%
Total	44.017%	45.299%	10.684%	100.000%

# ADDING FREQUENCIES



`adorn_ns(position = position)`

Parameters:

- ▶ `position` refers to the placement of the frequency values; can either be “front” or “rear”.



# ADDING FREQUENCIES



`adorn_ns(position = position)`



Using the `cyl` and `drv` variables from ggplot2's mpg data:

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages("row") %>%  
+   adorn_pct_formatting(digits = 3) %>%  
+   adorn_ns(position = "front")
```



Should be used in a pipeline after the `tabyl()` function and `adorn_totals()` (if used)!

### 3. CONTINGENCY TABLES IN R

---

# ADDING PERCENTAGES

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages("row") %>%  
+   adorn_pct_formatting(digits = 3) %>%  
+   adorn_ns(position = "front")
```

cyl	4	f	r	Total
4	23 (28.395%)	58 (71.605%)	0 (0.000%)	81 (100.000%)
5	0 (0.000%)	4 (100.000%)	0 (0.000%)	4 (100.000%)
6	32 (40.506%)	43 (54.430%)	4 (5.063%)	79 (100.000%)
8	48 (68.571%)	1 (1.429%)	21 (30.000%)	70 (100.000%)
Total	103 (44.017%)	106 (45.299%)	25 (10.684%)	234 (100.000%)

### 3. CONTINGENCY TABLES IN R

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# CONVERTING TO L<sup>A</sup>T<sub>E</sub>X

```
> mpg %>%  
+   tabyl(cyl, drv) %>%  
+   adorn_totals(where = c("row", "col")) %>%  
+   adorn_percentages("row") %>%  
+   adorn_pct_formatting(digits = 3) %>%  
+   adorn_ns(position = "front") -> table  
  
> stargazer(table, title = "Cylinders by Drivetrain",  
  summary = FALSE)
```

<<<<< OUTPUT OMITTED >>>>>

# 4 CHI-SQUARE TEST IN R

# HYPOTHESES

- ▶  $H_0$  is that there **is no** meaningful relationship between  $x$  and  $y$
- ▶  $H_1$  is that there **is** a meaningful relationship between  $x$  and  $y$

# ASSUMPTIONS

- ▶ Discrete (nominal or ordinal) data for both  $x$  and  $y$
- ▶ Independence between  $x$  and  $y$
- ▶ Sample size greater than 30
- ▶ Less than 20% of cells can have an expected count of less than 5 cases, and no cell should have an expected count less than 1
  - These are known as the "Cochran conditions"
  - Cochran himself acknowledged that 5 was an arbitrary value.

# CHI-SQUARE TEST

f(x)

`chi.square(xvar, yvar)`

Parameters:

► `xvar`  
`spec`



Available in `stats`

Included in standard distributions of R

be

# CHI-SQUARE TEST

**f(x)**

`chi.square(xvar, yvar)`

Parameters:

- ▶ `xvar` and `yvar` are the two variables to be tested; they must both be specified with the data frame and the dollar sign



# CHI-SQUARE TEST

f(x)

```
chi.square(xvar, yvar)
```



Using the `cyl` and `drv` variable from ggplot2's mpg data:

```
> chisq.test(mpg$cyl, mpg$drv)
```

```
<<<<< OUTPUT OMITTED >>>>>
```



Can be used with numeric, factor, or character variables.

## 4. CHI-SQUARE TEST IN R

---

# CHI-SQUARE TEST

```
> chisq.test(mpg$cyl, mpg$drv)
```

```
Pearson's Chi-squared test
```

```
data: mpg$cyl and mpg$drv
```

```
X-squared = 98.136, df = 6, p-value < 2.2e-16
```

```
Warning message:
```

```
In chisq.test(mpg$cyl, mpg$drv) :
```

```
Chi-squared approximation may be incorrect
```

## 4. CHI-SQUARE TEST IN R

---

# CHI-SQUARE TEST

```
> chisq.test(mpg$cyl, mpg$drv)
```

Pearson's Chi-squared test

data: mpg\$cyl and mpg\$drv

X-squared = 98.136, df = 6, p-value < 2.2e-16



How would you interpret this result?

## 4. CHI-SQUARE TEST IN R

---

# CHI-SQUARE TEST

```
> chisq.test(mpg$cyl, mpg$drv)
```

```
Pearson's Chi-squared test
```

```
data: mpg$cyl and mpg$drv
```

```
X-squared = 98.136, df = 6, p-value < 2.2e-16
```



The chi-square test ( $\chi^2 = 98.136$ ,  $df = 6$ ,  $p < .001$ ) indicates that there is substantial variation in cylinders by drive train type.

# COCHRAN CONDITIONS



`model$expected`



Using the `cyl` and `drv` variable from ggplot2's mpg data:

```
> model <- chisq.test(mpg$cyl, mpg$drv)
> model$expected
```

<<<<< OUTPUT OMITTED >>>>>



Execute the chi-squared test twice, once to get the standard output and once to check the expected frequencies.

## 4. CHI-SQUARE TEST IN R

---

# COCHRAN CONDITIONS

```
> model <- chisq.test(mpg$cyl, mpg$drv)
```

Warning message:

In `chisq.test(mpg$cyl, mpg$drv)` :

Chi-squared approximation may be incorrect

```
> model$expected
```

	mpg\$drv			
mpg\$cyl	4	f	r	
4	35.653846	36.692308	8.6538462	
5	1.760684	1.811966	0.4273504	
6	34.773504	35.786325	8.4401709	
8	30.811966	31.709402	7.4786325	

## 4. CHI-SQUARE TEST IN R

---

# COCHRAN CONDITIONS

```
> model <- chisq.test(mpg$cyl, mpg$drv)
```

Warning message:

```
In chisq.test(mpg$cyl, mpg$drv) :
```

```
Chi-squared approximation may be incorrect
```

```
> model$expected
```

	mpg\$drv			
mpg\$cyl	4	f	r	
4	35.653846	36.692308	8.6538462	
5	1.760684	1.811966	0.4273504	
6	34.773504	35.786325	8.4401709	
8	30.811966	31.709402	7.4786325	

3 of the 12 cells (or 25%)  
are less 5, and 1 cell is  
less than one, violating  
Cochran's conditions

## 4. CHI-SQUARE TEST IN R

---

# COCHRAN CONDITIONS

```
> model <- chisq.test(mpg$cyl, mpg$drv)
```

Warning message:

In `chisq.test(mpg$cyl, mpg$drv)` :

Chi-squared approximation may be incorrect

```
> model$expected
```

	mpg\$drv			
mpg\$cyl	4	f	r	
4	35.653846	36.692308	8.6538462	
5	1.760684	1.811966	0.4273504	
6	34.773504	35.786325	8.4401709	
8	30.811966	31.709402	7.4786325	



# FISHER'S EXACT TEST

**f(x)**

```
fisher.test(xvar, yvar, simulate.p.value = TRUE)
```

Parameters:

- ▶ `xvar` and `yvar` are the two variables to be tested; they must both be specified with the data frame and the dollar sign
- ▶ `simulate.p.value` uses a Monte Carlo simulation process to find the best  $p$ -value; the alternative (if `FALSE`) is far more computationally consuming (in terms of time and computer processing power)

# FISHER'S EXACT TEST

**f(x)**

```
fisher.test(xvar, yvar, simulate.p.value = TRUE)
```



Using the `cyl` and `drv` variable from `ggplot2`'s `mpg` data:

```
> fisher.test(mpg$cyl, mpg$drv, simulate.p.value =  
TRUE)
```

<<<<< OUTPUT OMITTED >>>>>



Use this test to find the  $p$ -value if the Cochran conditions are not met.

# FISHER'S EXACT TEST

```
> fisher.test(mpg$cyl, mpg$drv, simulate.p.value = TRUE)
```

```
    Fisher's Exact Test for Count Data with simulated p-value (based  
on 2000 replicates)
```

```
data:  mpg$cyl and mpg$drv
```

```
p-value = 0.0004998
```

```
alternative hypothesis: two.sided
```

# 5 BACK MATTER

# WHAT WE COVERED TODAY

2. Chi-square Test Theory
3. Contingency Tables in R
4. Chi-square in R

## 5. BACK MATTER

---

# REMINDERS



Lab-16 and **all final project** materials are due by next Monday (12/18) at 4:00pm



Final project submissions on GitHub should include code and pdfs of handout, slides, and (if necessary) your paper.



Final grades available by end of business on Wednesday, 12/20



We have not hit the required response rate for course evals!