

# Hypothesis test for a proportion

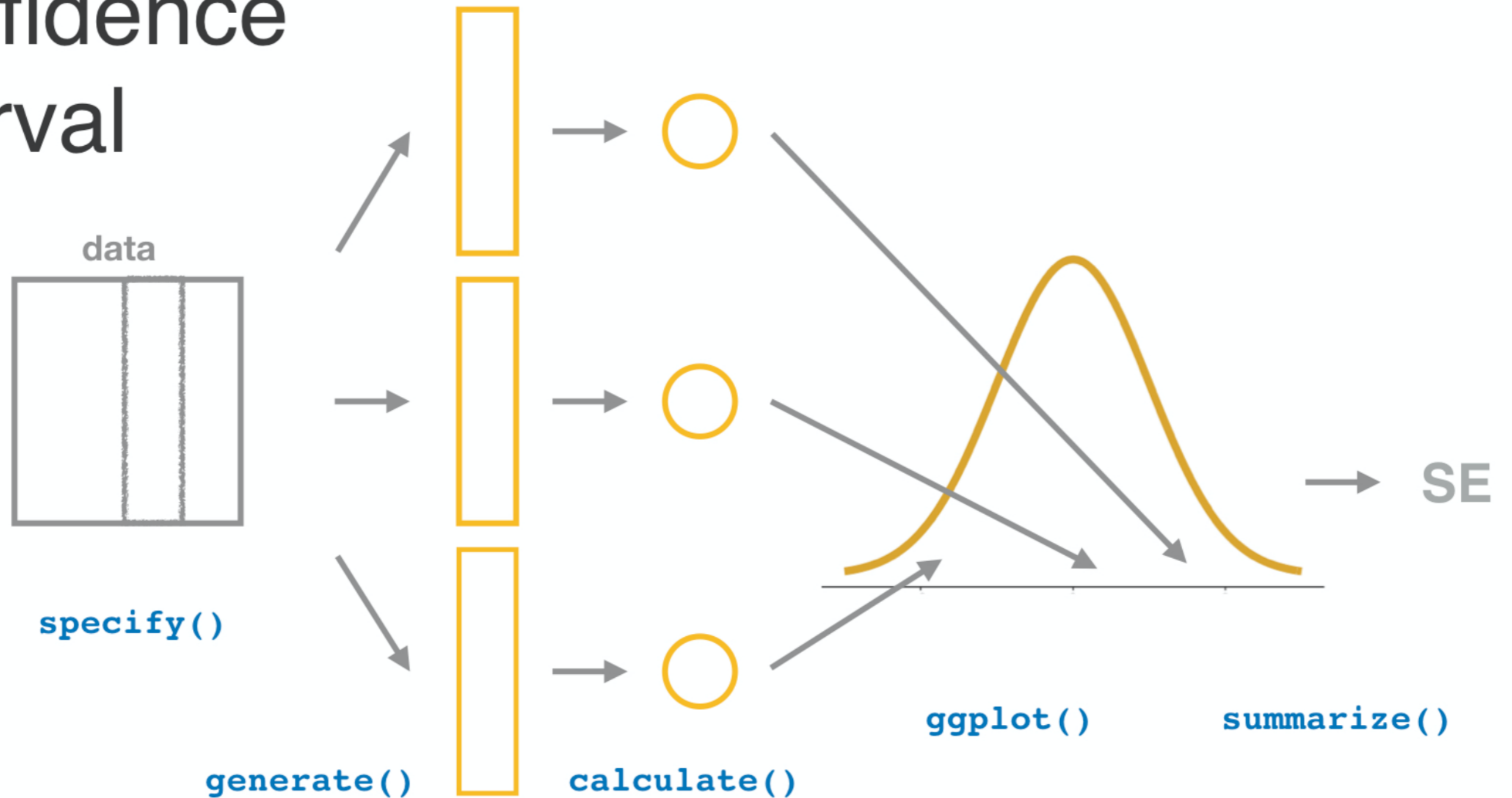
INFERENCE FOR CATEGORICAL DATA IN R



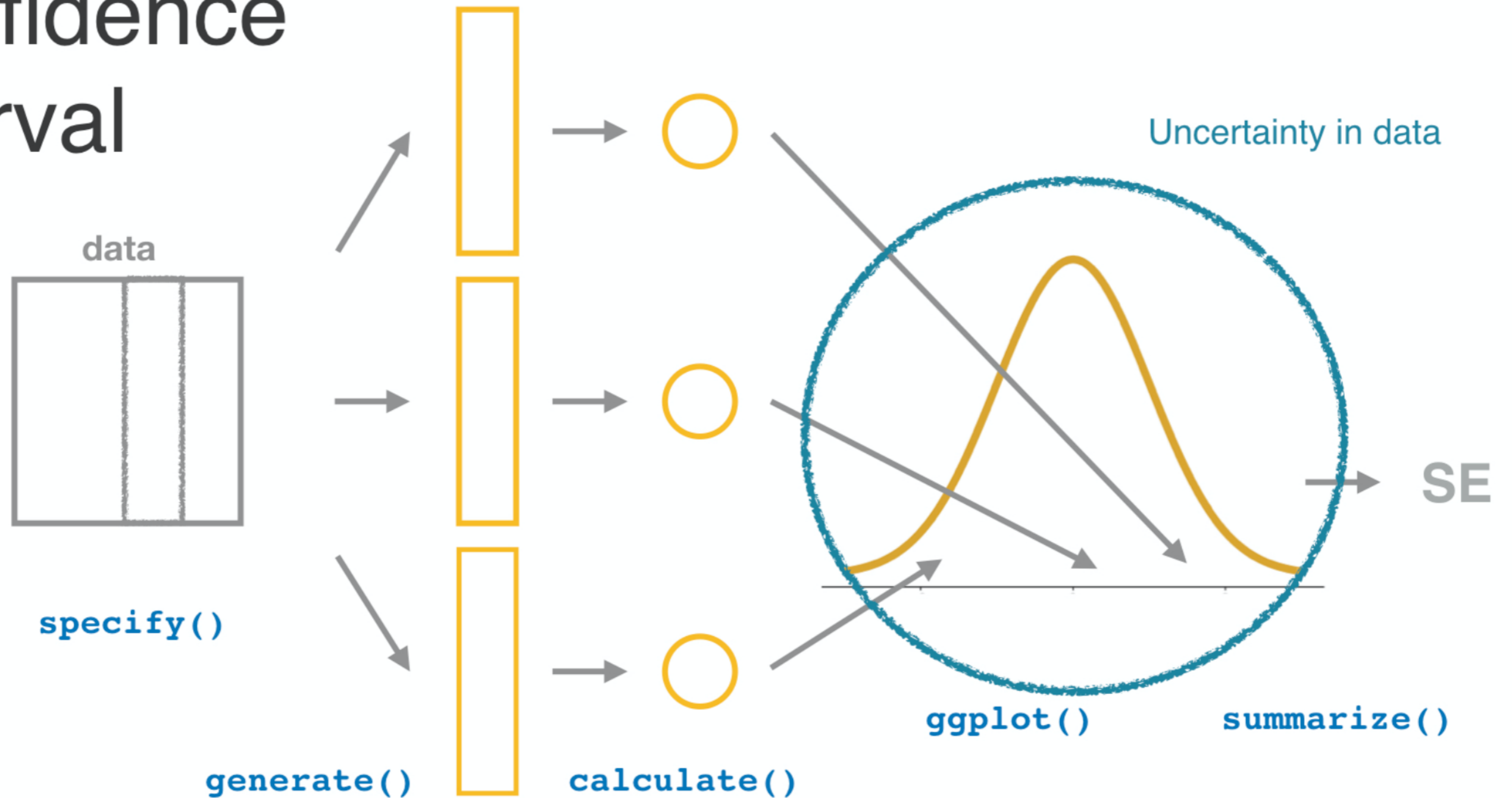
**Andrew Bray**

Assistant Professor of Statistics at Reed College

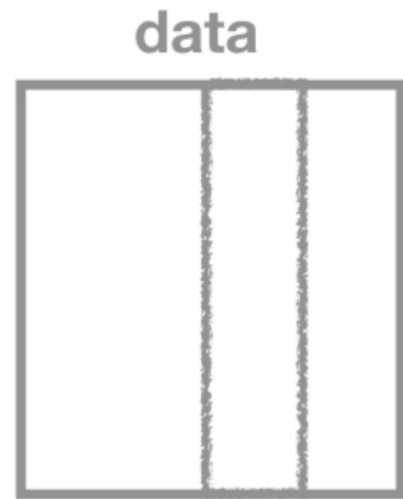
# Confidence Interval



# Confidence Interval



# Hypothesis Test

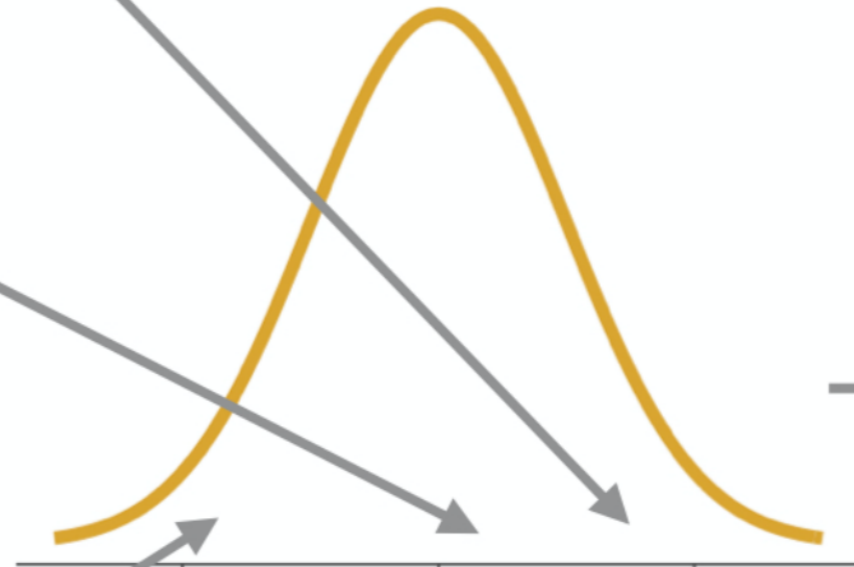


`specify()`

`generate()`



`calculate()`

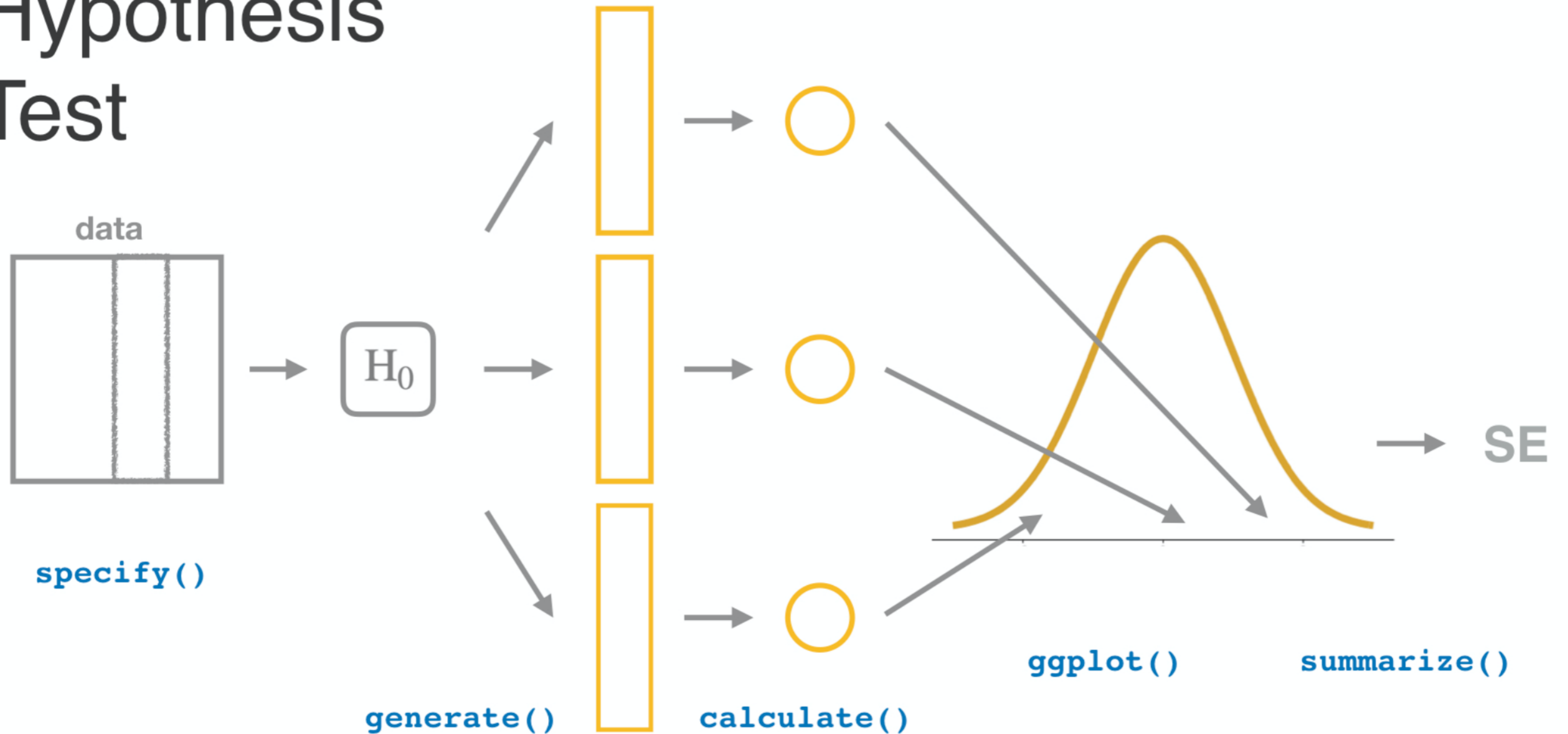


`ggplot()`

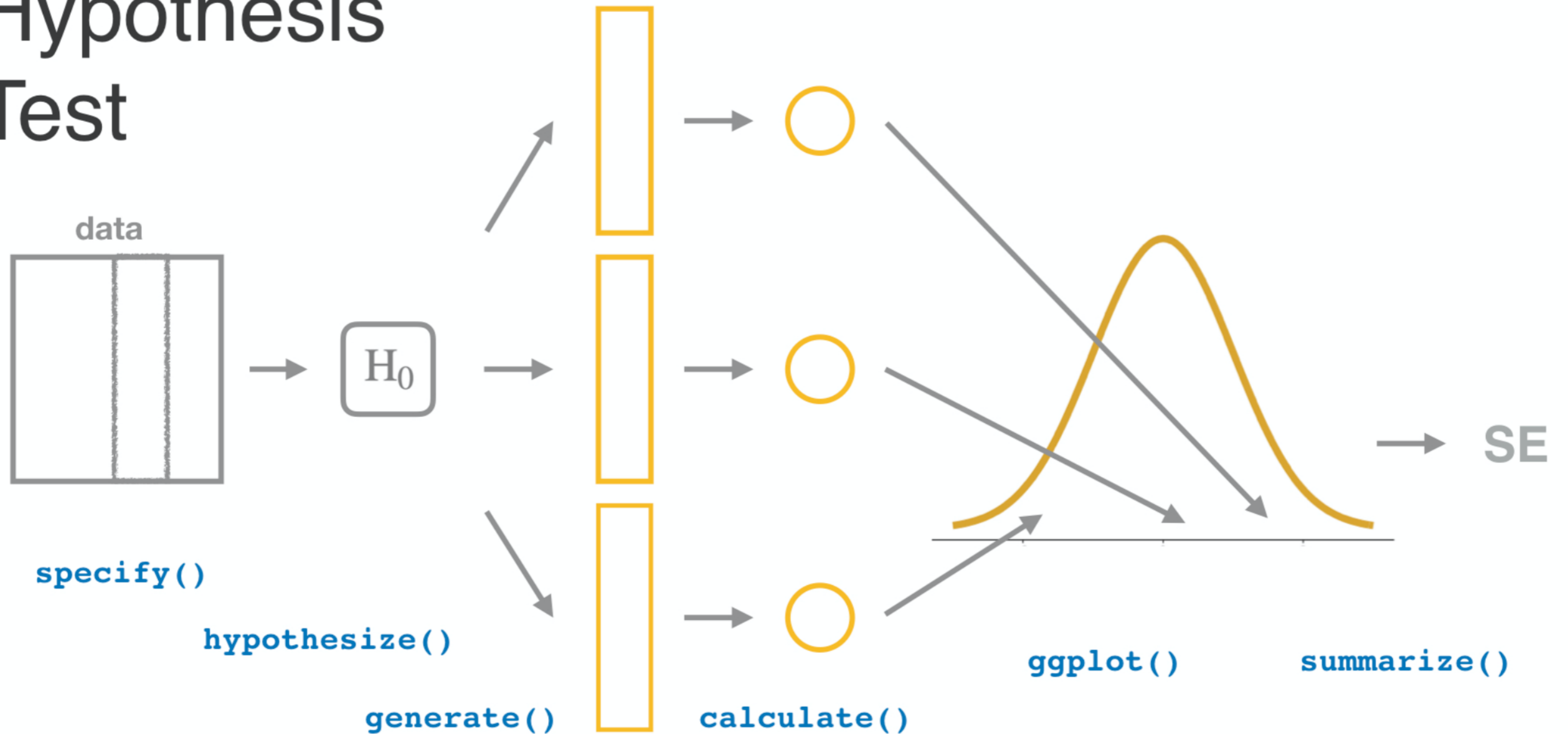
`summarize()`

SE

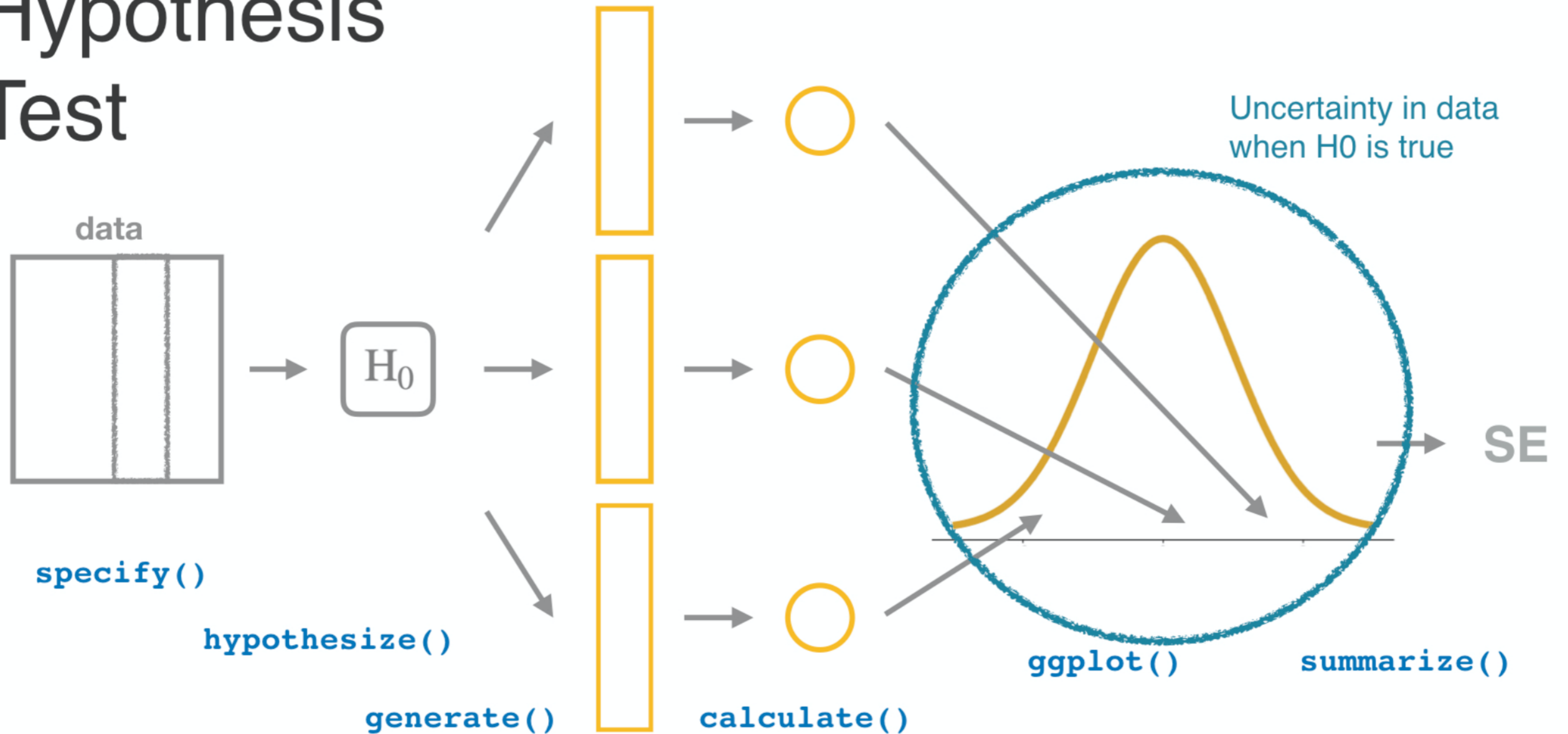
# Hypothesis Test



# Hypothesis Test



# Hypothesis Test

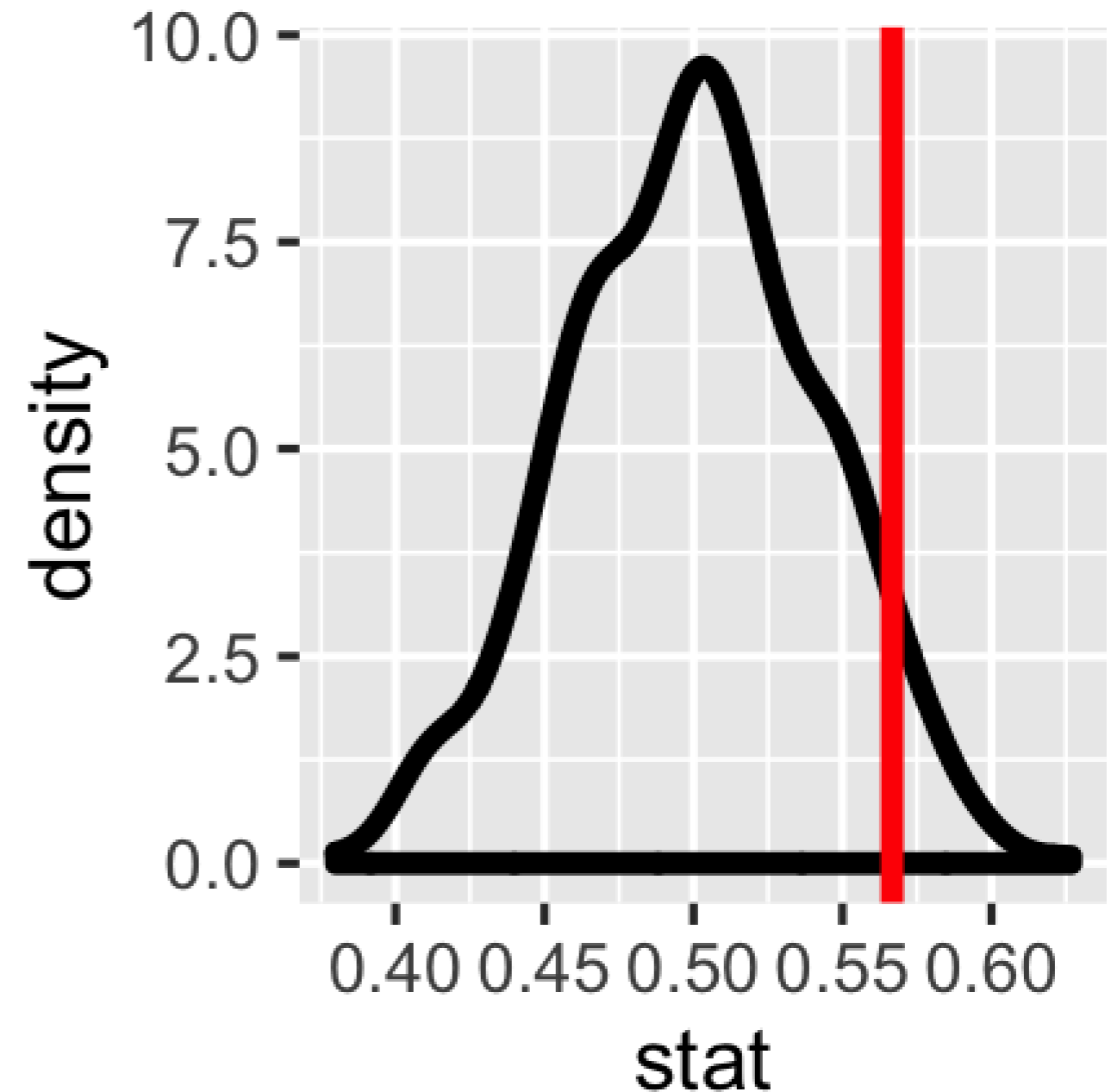


# Do half of Americans favor capital punishment?

```
gss2016 %>%  
  ggplot(aes(x = cappun)) +  
  geom_bar()
```

```
p_hat <- gss2016 %>%  
  summarize(mean(cappun == "FAVOR")) %>%  
  pull()  
p_hat
```

0.5666667





# Do half of Americans favor capital punishment?

```
null <- gss2016 %>%  
  specify(  
    response = cappun,  
    success = "FAVOR"  
  ) %>%
```

```
hypothesize(  
  null = "point",  
  p = 0.5  
) %>%
```

```
generate(  
  reps = 500,  
  type = "simulate"  
) %>%
```

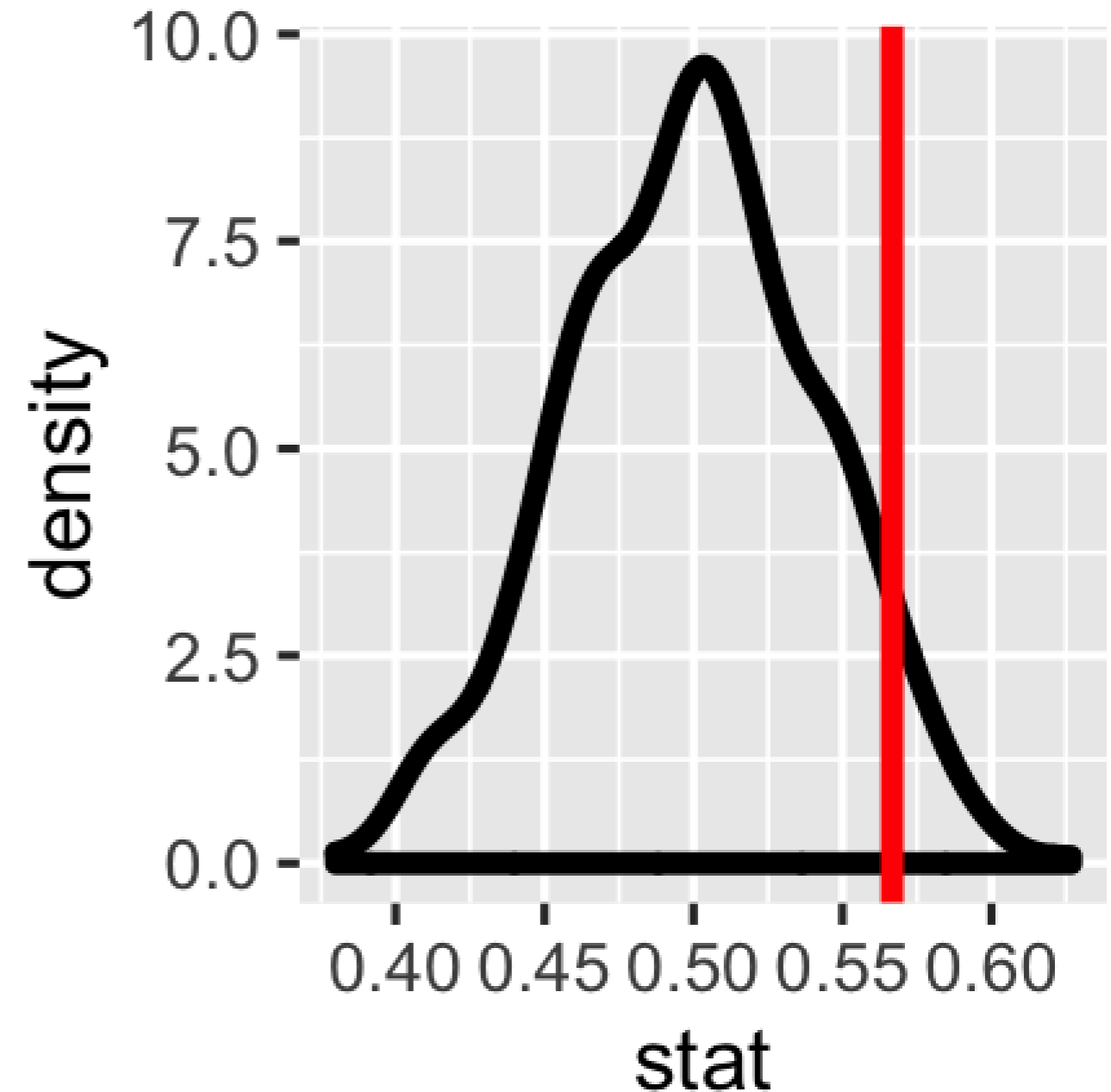
```
calculate(stat = "prop")
```

```
A tibble: 500 x 2  
  replicate  stat  
  <fct>      <dbl>  
1 1          0.48  
2 2          0.447  
3 3          0.48  
4 4          0.44  
5 5          0.407  
6 6          0.52  
7 7          0.413  
8 8          0.553  
9 9          0.52  
10 10         0.467  
# ... with 490 more rows
```

# Do half of Americans favor capital punishment?

```
ggplot(null, aes(x = stat)) +  
  geom_density() +  
  geom_vline(  
    xintercept = p_hat,  
    color = "red"  
  )
```

```
null %>%  
  summarize(mean(stat > p_hat)) %>%  
  pull() * 2
```



# Hypothesis test

- Null hypothesis: theory about the state of the world.
- Null distribution: distribution of test statistics assuming null is true.
- p-value: a measure of consistency between null hypothesis and your observations.
  - high p-value: consistent ( $p\text{-val} > \alpha$ )
  - low p-value: inconsistent ( $p\text{-val} < \alpha$ )

# Let's practice!

INFERENCE FOR CATEGORICAL DATA IN R

# Intervals for differences

INFERENCE FOR CATEGORICAL DATA IN R



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Assistant Professor of Statistics at Reed College

# A question in two variables

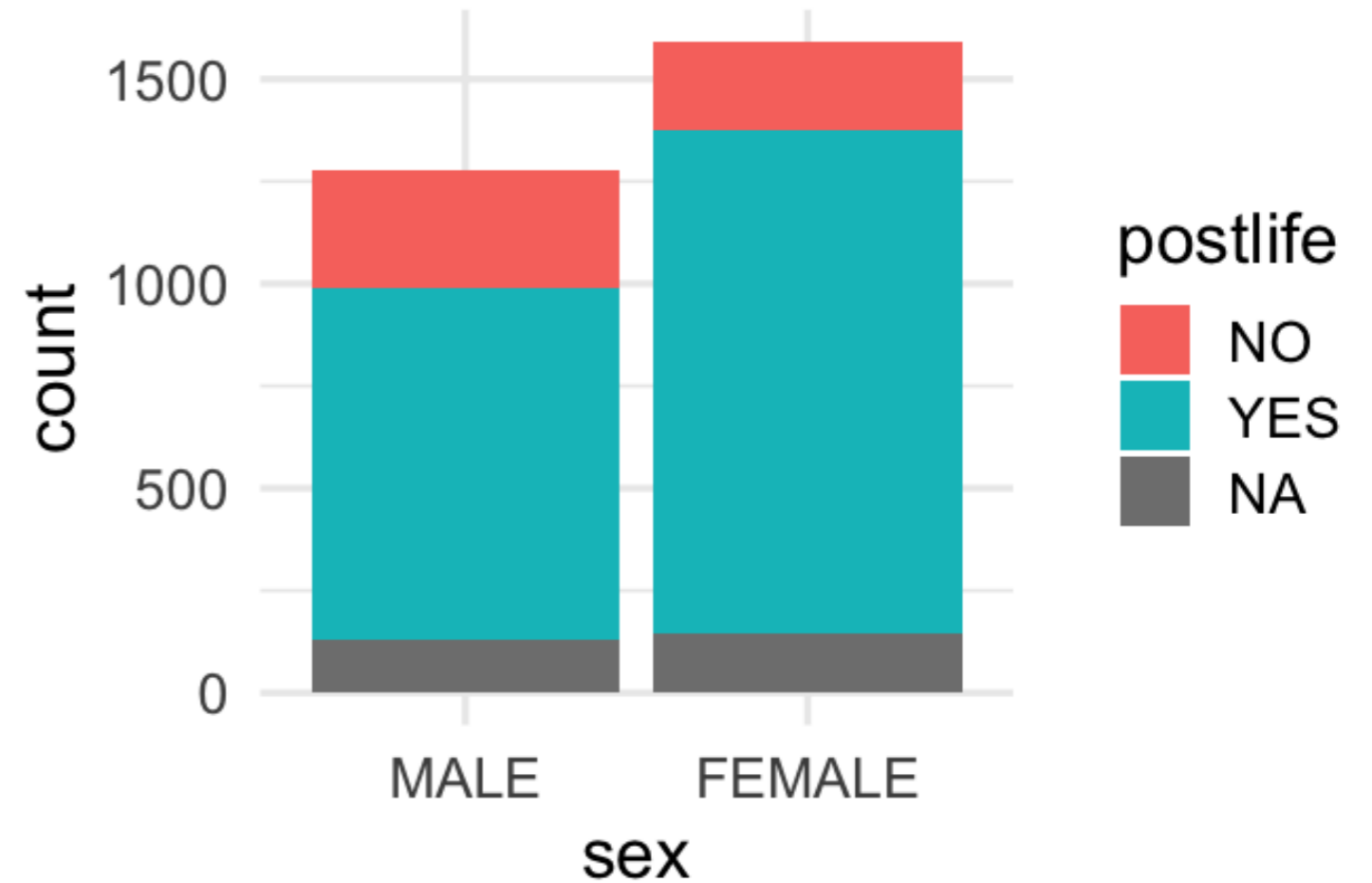
Do women and men believe at different rates?

Let  $p$  be the proportion that believe in life after death.

- $H_0 : p_{female} - p_{male} = 0$
- $H_A : p_{female} - p_{male} \neq 0$

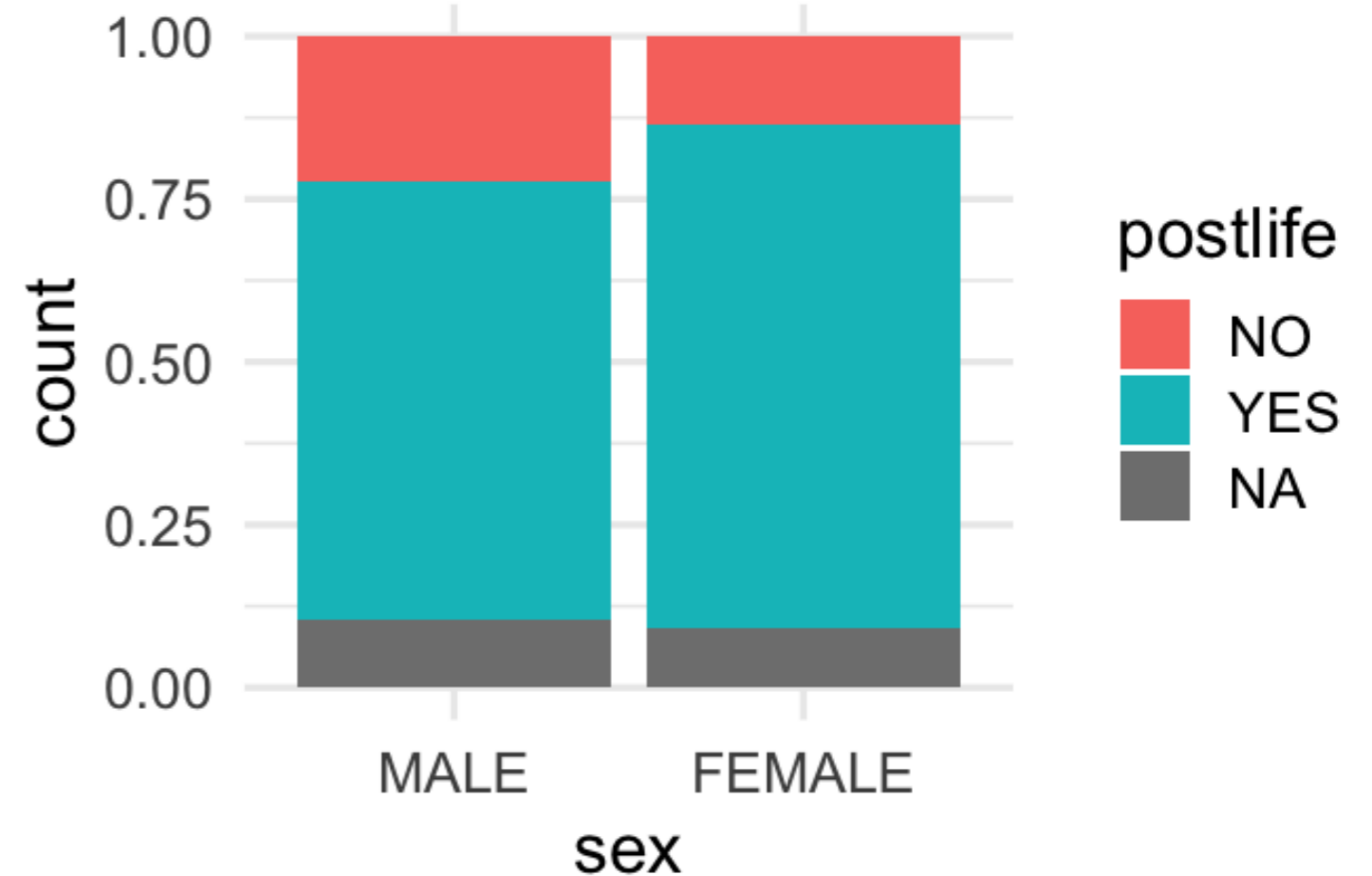
# Do women and men have different opinions on life after death?

```
ggplot(gss2016, aes(x = sex, fill = postlife)) +  
  geom_bar()
```



# Do women and men have different opinions on life after death?

```
ggplot(gss2016, aes(x = sex, fill = postlife)) +  
  geom_bar(position = "fill")
```





# Do women and men have different opinions on life after death?

```
p_hats <- gss2016 %>%  
  group_by(sex) %>%  
  summarize(mean(postlife == "YES", na.rm = TRUE)) %>%  
  pull()
```

```
d_hat <- diff(p_hats)  
d_hat
```

```
0.1472851
```

# Generating data from $H_0$

- $H_0 : p_{female} - p_{male} = 0$
- There is no association between belief in the afterlife and the sex of a subject.
- The variable `postlife` is independent from the variable `sex`.

⇒ **Generate data by permutation**

# Do women and men have different opinions on life after death?

```
gss2016 %>%  
  specify(  
    response = postlife,  
    explanatory = sex,  
    success = "YES"  
  ) %>%  
  hypothesize(null = "independence") %>%  
  generate(reps = 1, type = "permute")
```

# Do women and men have different opinions on life after death?

```
gss2016 %>%  
  specify(  
    postlife ~ sex, # this line is new  
    success = "YES"  
  ) %>%  
  hypothesize(null = "independence") %>%  
  generate(reps = 1, type = "permute")
```

```
Response: postlife (factor)  
Explanatory: sex (factor)  
Null Hypothesis: independence  
# A tibble: 137 x 3  
# Groups:   replicate [1]  
  postlife sex      replicate  
  <fct>    <fct>      <int>  
1 YES     FEMALE      1  
2 YES     MALE        1  
3 YES     FEMALE      1  
4 YES     MALE        1  
5 YES     MALE        1  
6 YES     FEMALE      1  
7 NO     FEMALE      1
```

# Do women and men have different opinions on life after death?

```
gss2016 %>%  
  specify(  
    postlife ~ sex,  
    success = "YES"  
  ) %>%  
  hypothesize(null = "independence") %>%  
  generate(reps = 1, type = "permute")
```

```
Response: postlife (factor)  
Explanatory: sex (factor)  
Null Hypothesis: independence  
# A tibble: 137 x 3  
# Groups:   replicate [1]  
  postlife sex      replicate  
  <fct>    <fct>      <int>  
1 YES     FEMALE      1  
2 NO      MALE        1  
3 NO      FEMALE      1  
4 YES     MALE        1  
5 YES     MALE        1  
6 YES     FEMALE      1  
7 YES     FEMALE      1
```

# Do women and men have different opinions on life after death?

```
gss2016 %>%  
  specify(postlife ~ sex, success = "YES") %>%  
  hypothesize(null = "independence") %>%  
  generate(reps = 500, type = "permute") %>%  
  calculate(stat = "diff in props", order = c("FEMALE", "MALE"))
```

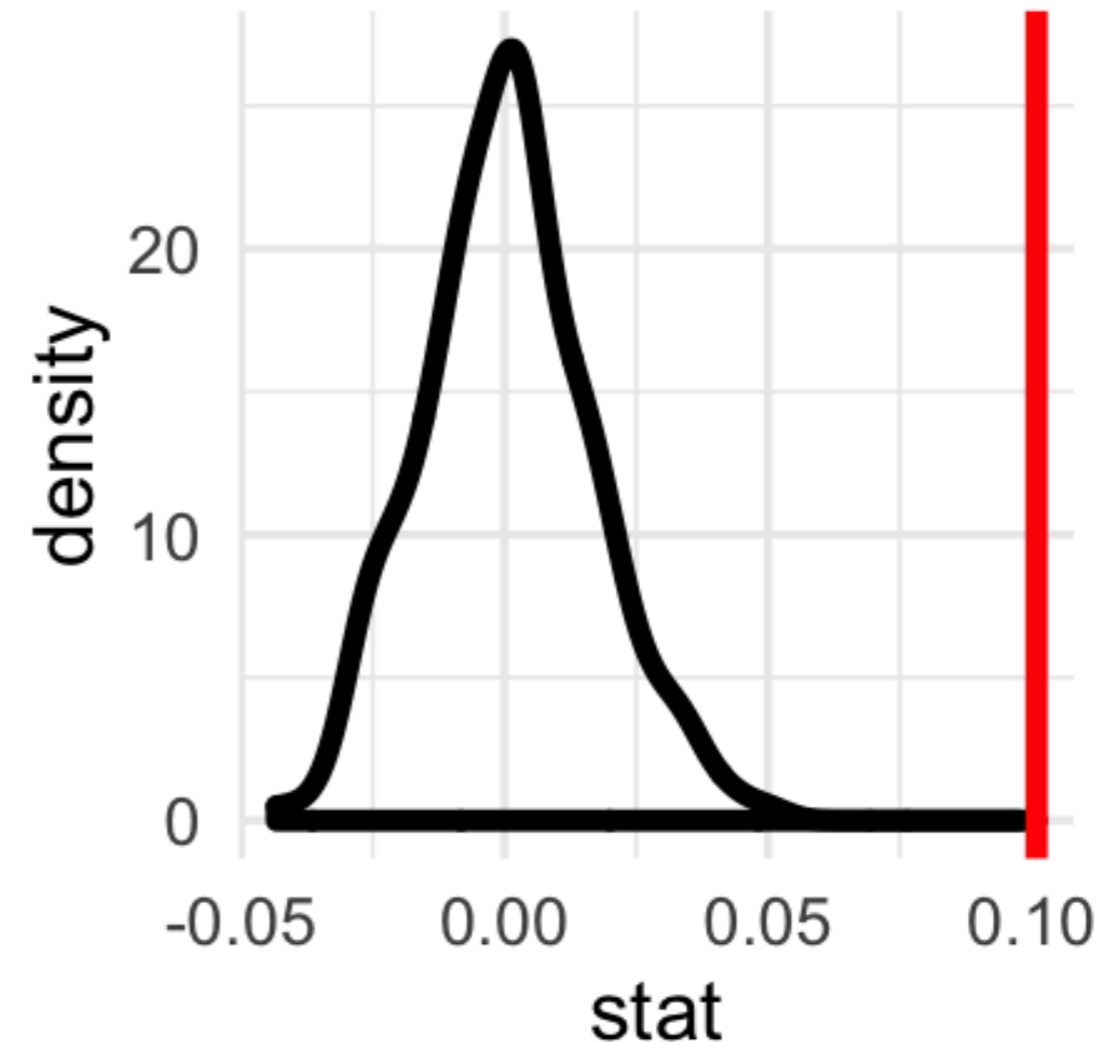
Warning message:

Removed 13 rows containing missing values.

# Do women and men have different opinions on life after death?

```
ggplot(null, aes(x = stat)) +  
  geom_density() +  
  geom_vline(xintercept = d_hat, color = "red")
```

These data suggest that there is a difference between sexes in the belief of life after death.



# Let's practice!

INFERENCE FOR CATEGORICAL DATA IN R



# Statistical errors

INFERENCE FOR CATEGORICAL DATA IN R



**Andrew Bray**

Assistant Professor of Statistics at Reed  
College

# Statistical Errors

Truth

|         |
|---------|
| H0 true |
|         |
|         |

# Statistical Errors

|          |           | Truth   |          |
|----------|-----------|---------|----------|
|          |           | H0 true | H0 false |
| Decision | retain H0 |         |          |
|          | reject H0 |         |          |

# Statistical Errors

|          |           | Truth         |              |
|----------|-----------|---------------|--------------|
|          |           | H0 true       | H0 false     |
| Decision | retain H0 | OK            | type I error |
|          | reject H0 | type II error | OK           |

# Statistical Errors

|          |           | Truth   |  |
|----------|-----------|---------|--|
|          |           | H0 true |  |
| Decision | retain H0 | OK      |  |
|          | reject H0 | Type I  |  |

# Statistical Errors

|          |           | Truth   |  |
|----------|-----------|---------|--|
|          |           | H0 true |  |
| Decision | retain H0 | OK      |  |
|          | reject H0 | Type I  |  |

What is the probability that you will reject a true null hypothesis?

# Statistical Errors

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$

|          |           | Truth   |          |
|----------|-----------|---------|----------|
|          |           | H0 true | H0 false |
| Decision | retain H0 | OK      | Type II  |
|          | reject H0 | Type I  | OK       |

What is the probability that you will reject a true null hypothesis?

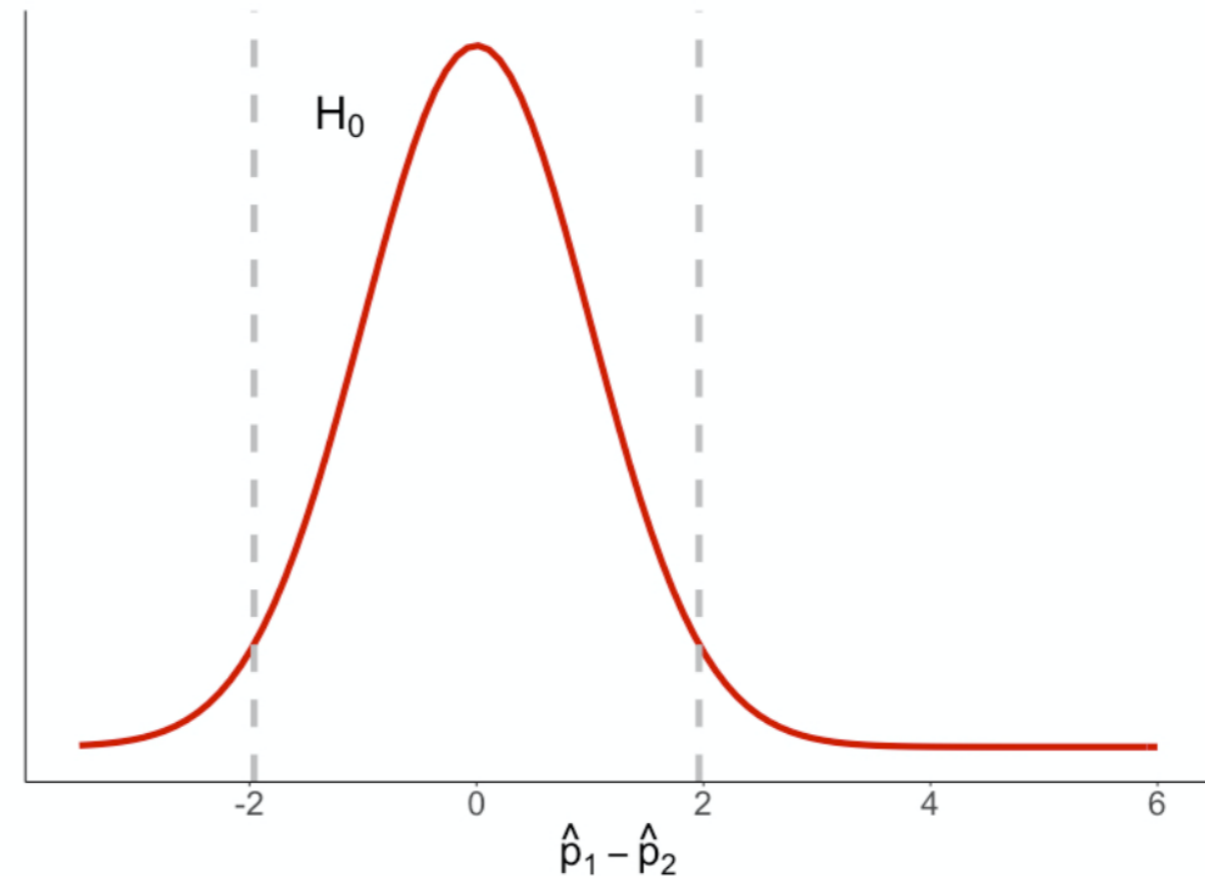
# Statistical Errors

|          |           | Truth   |          |
|----------|-----------|---------|----------|
|          |           | H0 true | H0 false |
| Decision | retain H0 | OK      | Type II  |
|          | reject H0 | Type I  | OK       |

What is the probability that you will reject a true null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$





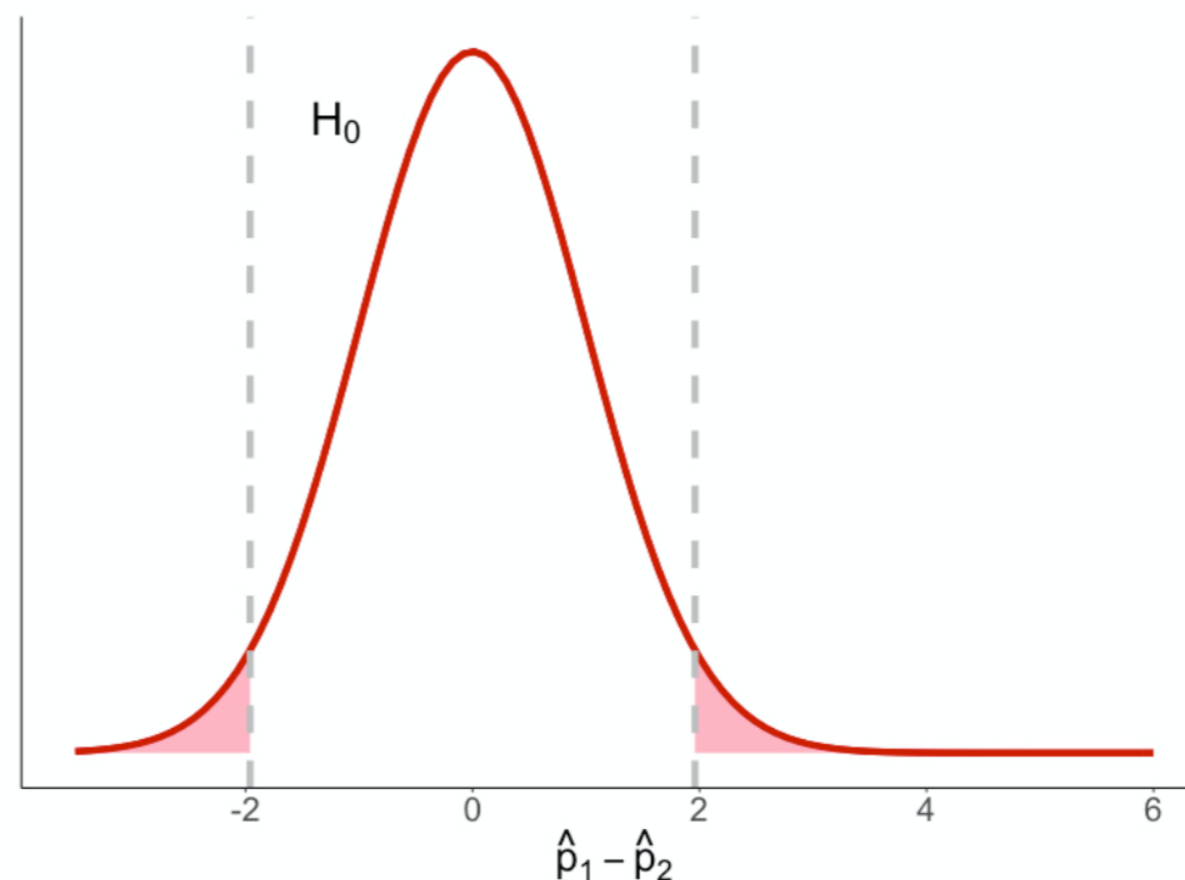
# Statistical Errors

|          |           | Truth   |          |
|----------|-----------|---------|----------|
|          |           | H0 true | H0 false |
| Decision | retain H0 | OK      | Type II  |
|          | reject H0 | Type I  | OK       |

What is the probability that you will reject a true null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Statistical Errors

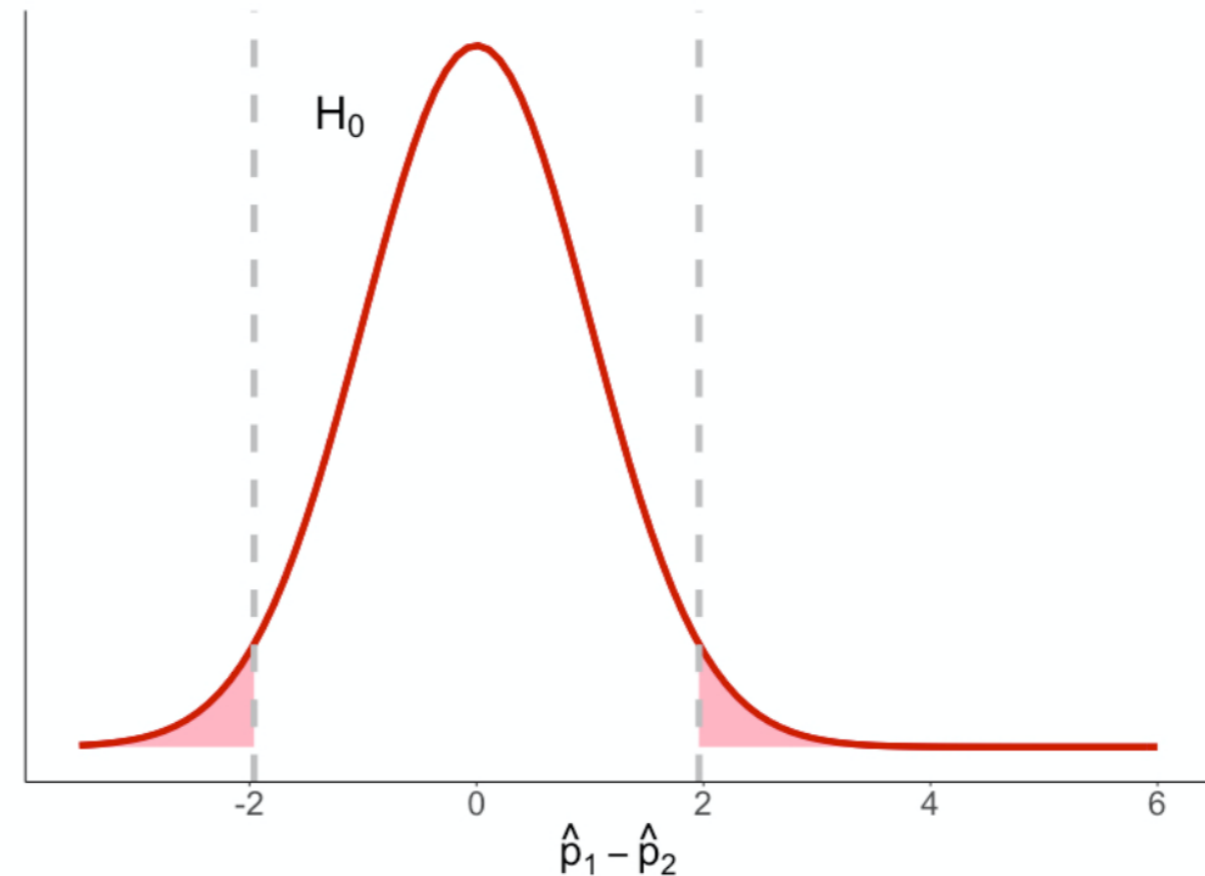
|          |           | Truth           |                 |
|----------|-----------|-----------------|-----------------|
|          |           | H0 true         | H0 false        |
| Decision | retain H0 | OK              | Type II $\beta$ |
|          | reject H0 | Type I $\alpha$ | OK              |

What is the probability that you will reject a true null hypothesis?

$\alpha$

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$

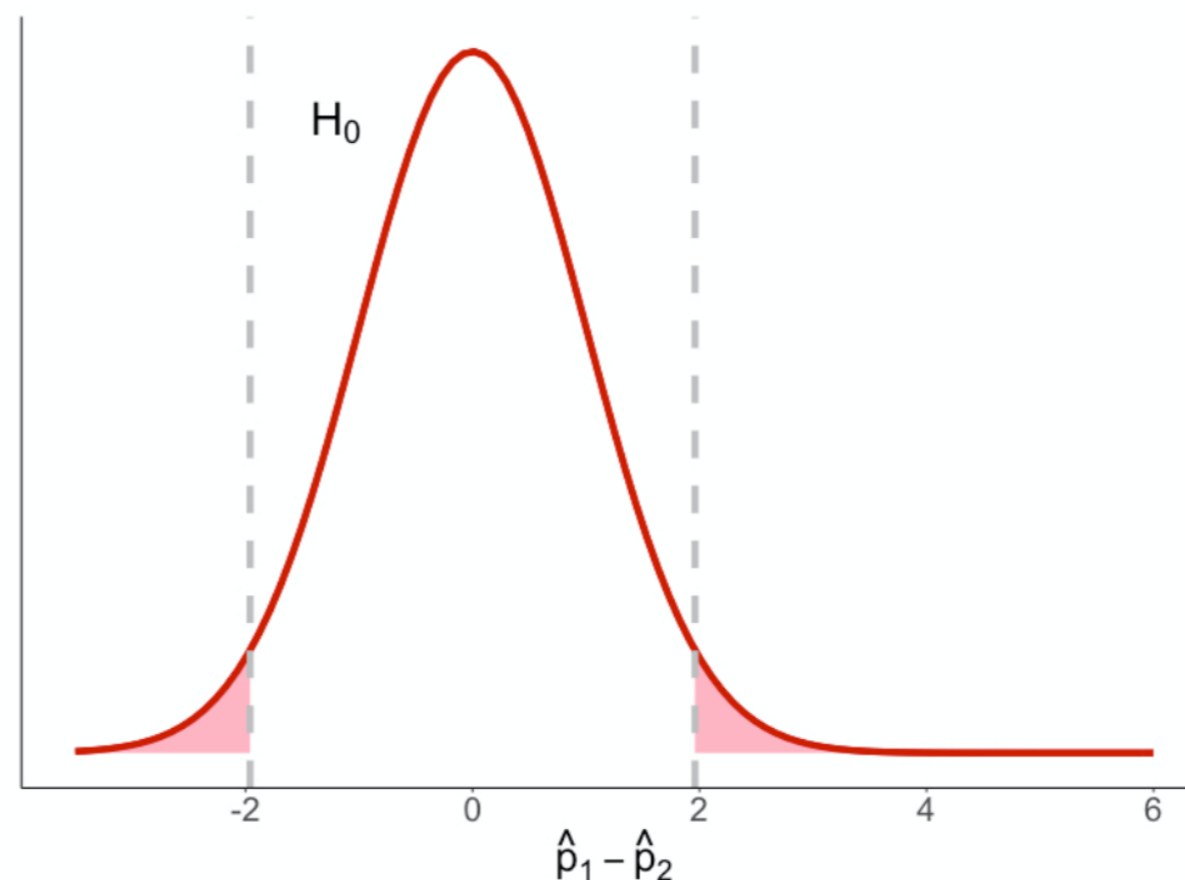


# Statistical Errors

|          |           | Truth           |                 |
|----------|-----------|-----------------|-----------------|
|          |           | H0 true         | H0 false        |
| Decision | retain H0 | OK              | Type II $\beta$ |
|          | reject H0 | Type I $\alpha$ | OK              |

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$

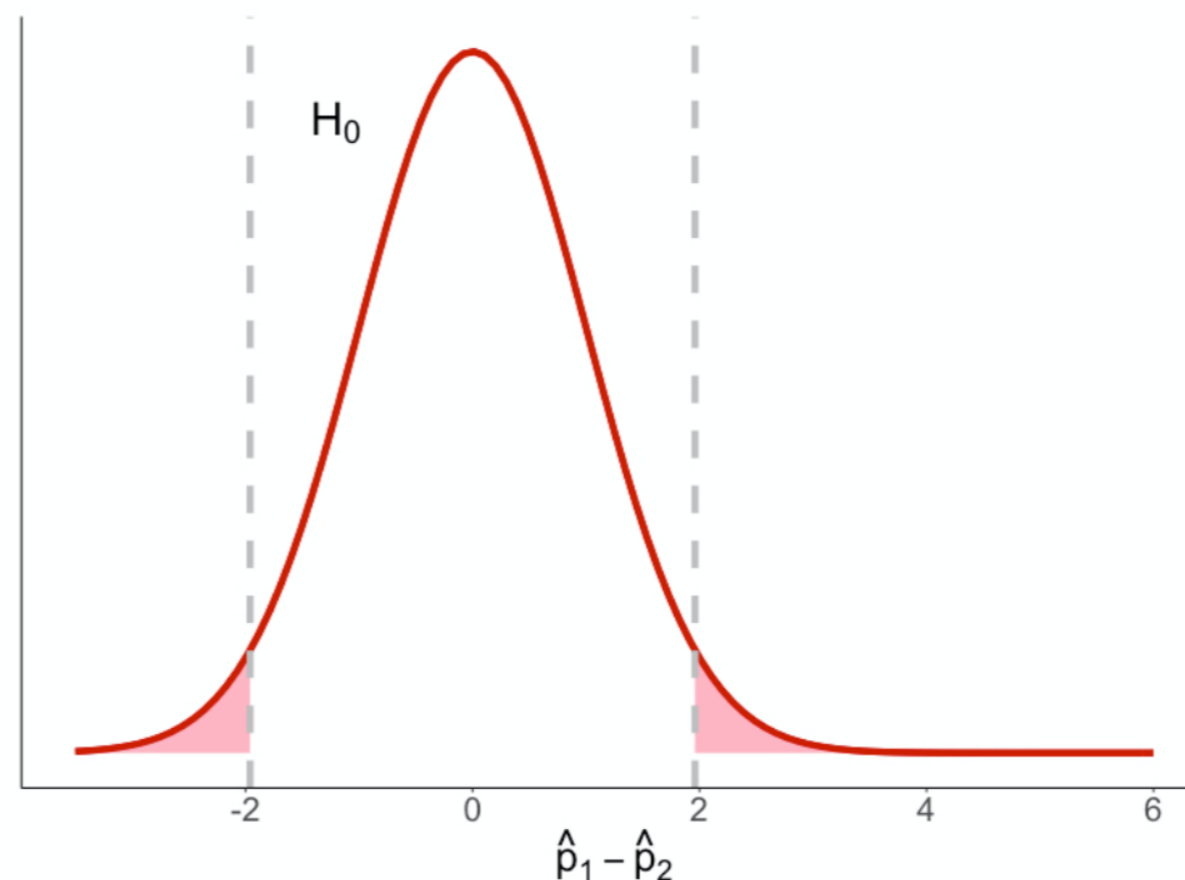


# Statistical Errors

|          |           | Truth              |          |
|----------|-----------|--------------------|----------|
|          |           | H0 true            | H0 false |
| Decision | retain H0 | OK                 |          |
|          | reject H0 | Type I<br>$\alpha$ |          |

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$

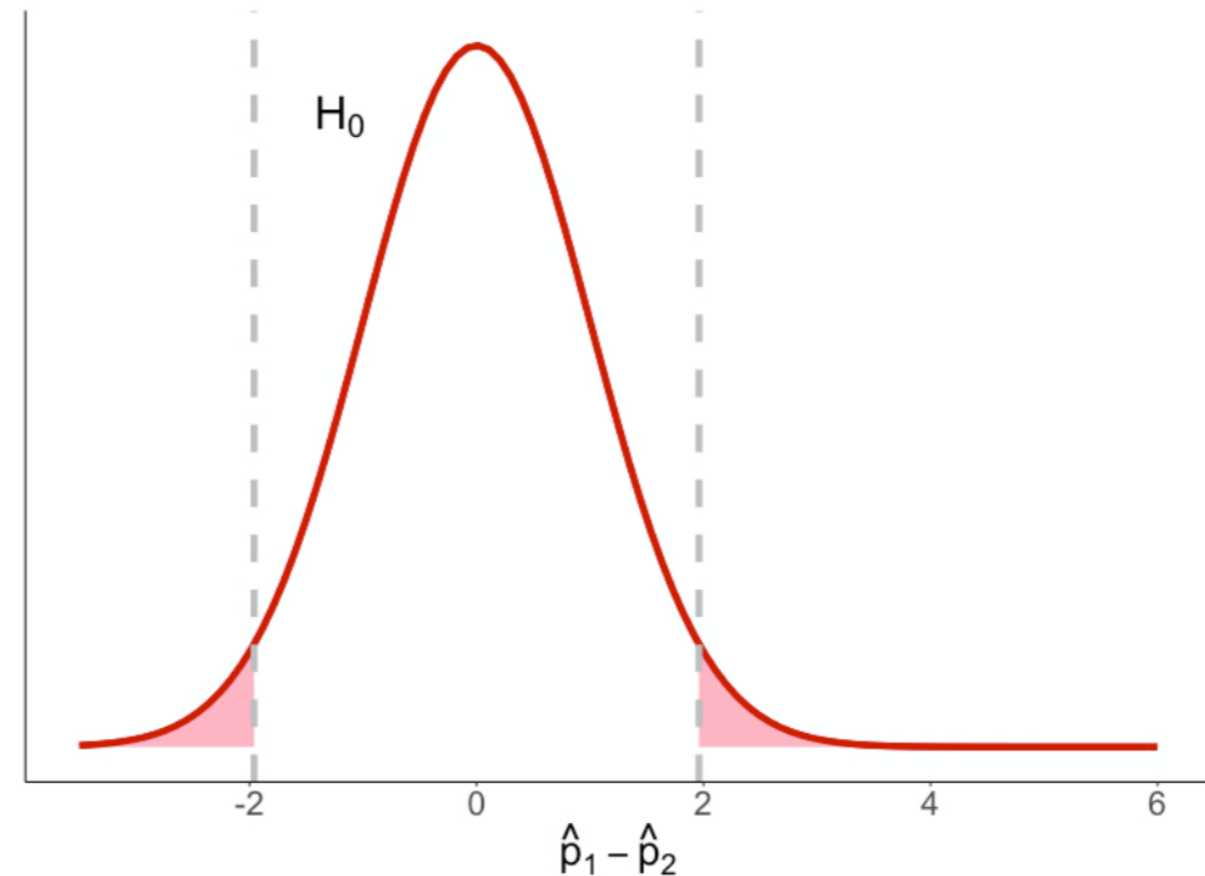


# Statistical Errors

|          |           | Truth              |          |
|----------|-----------|--------------------|----------|
|          |           | H0 true            | H0 false |
| Decision | retain H0 | OK                 |          |
|          | reject H0 | Type I<br>$\alpha$ | OK       |

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$

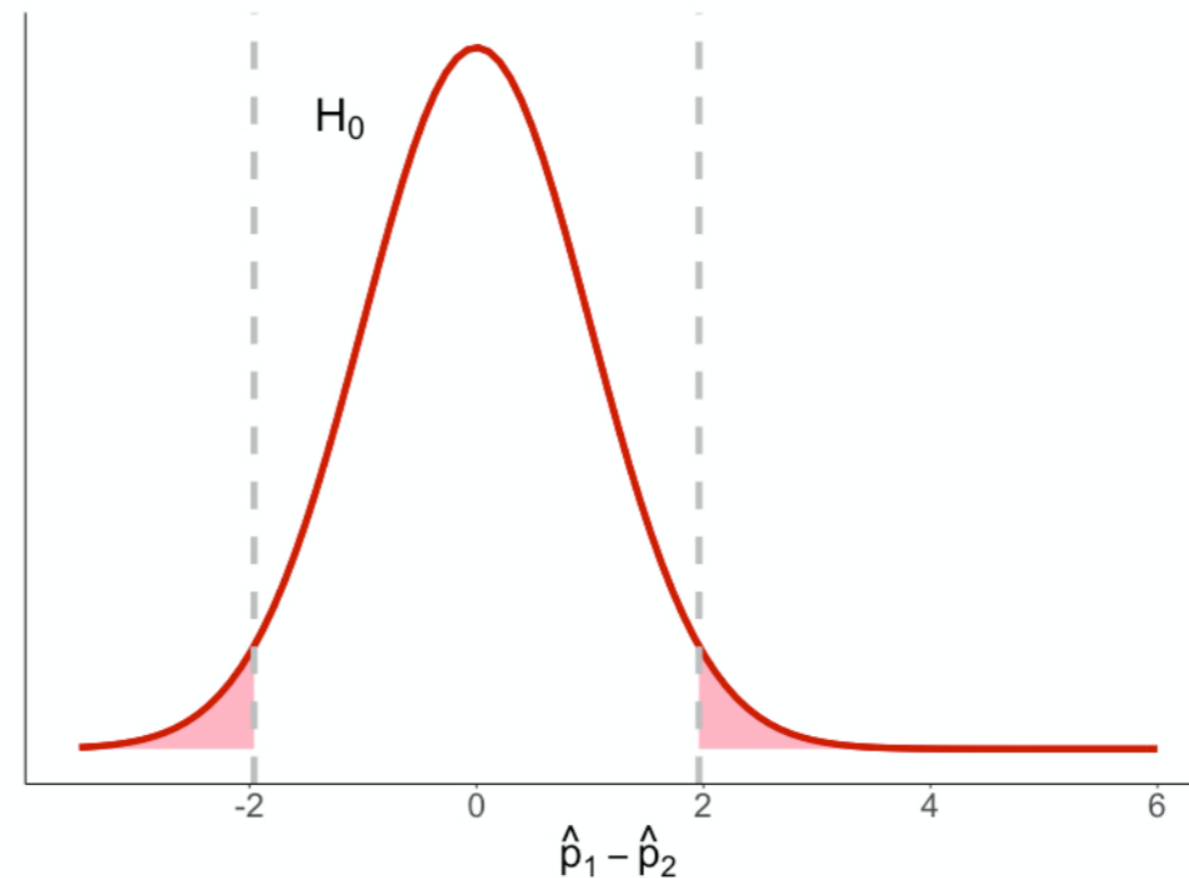


# Statistical Errors

|          |           | Truth              |          |
|----------|-----------|--------------------|----------|
|          |           | H0 true            | H0 false |
| Decision | retain H0 | OK                 | Type II  |
|          | reject H0 | Type I<br>$\alpha$ | OK       |

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Statistical Errors

Truth

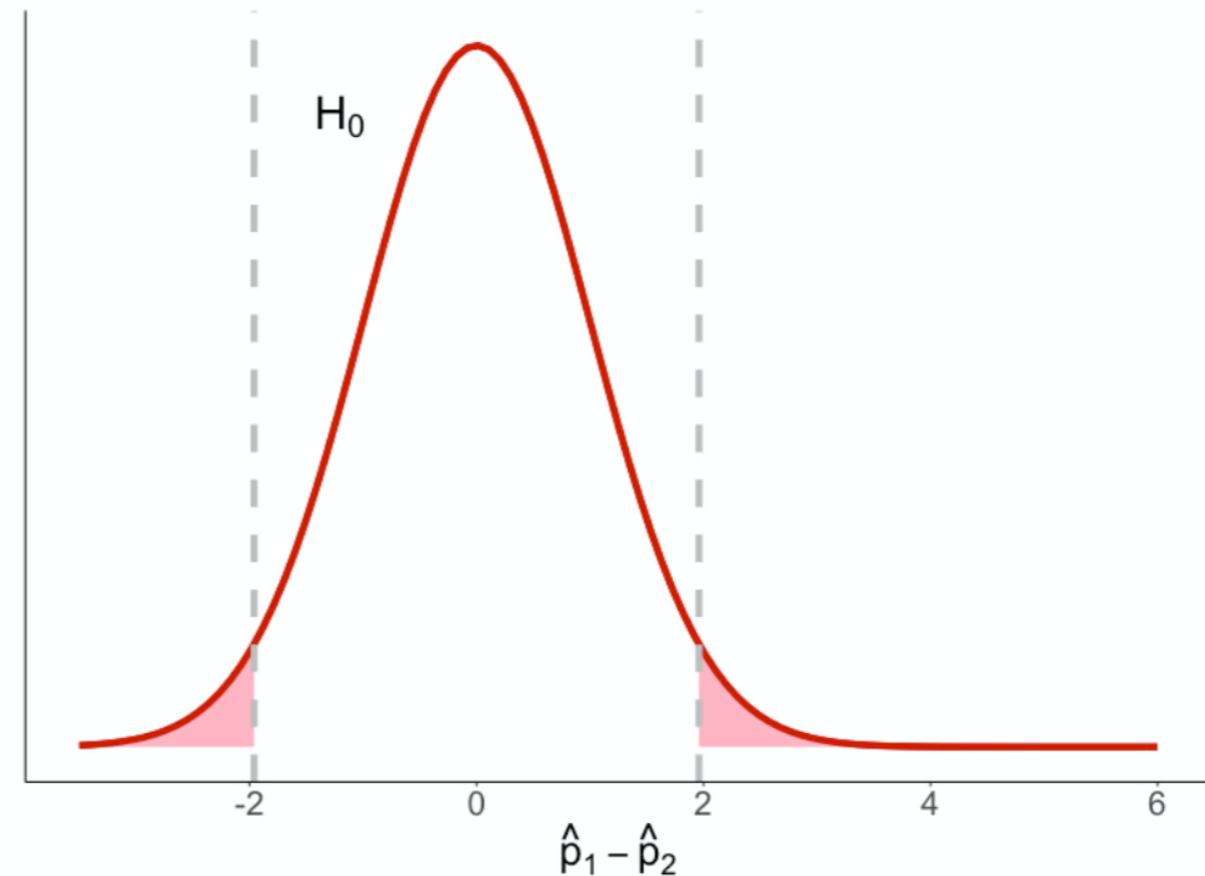
Decision

|           | H0 true            | H0 false |
|-----------|--------------------|----------|
| retain H0 | OK                 | Type II  |
| reject H0 | Type I<br>$\alpha$ | OK       |

What is the probability that you will fail to reject a false null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Statistical Errors

Truth

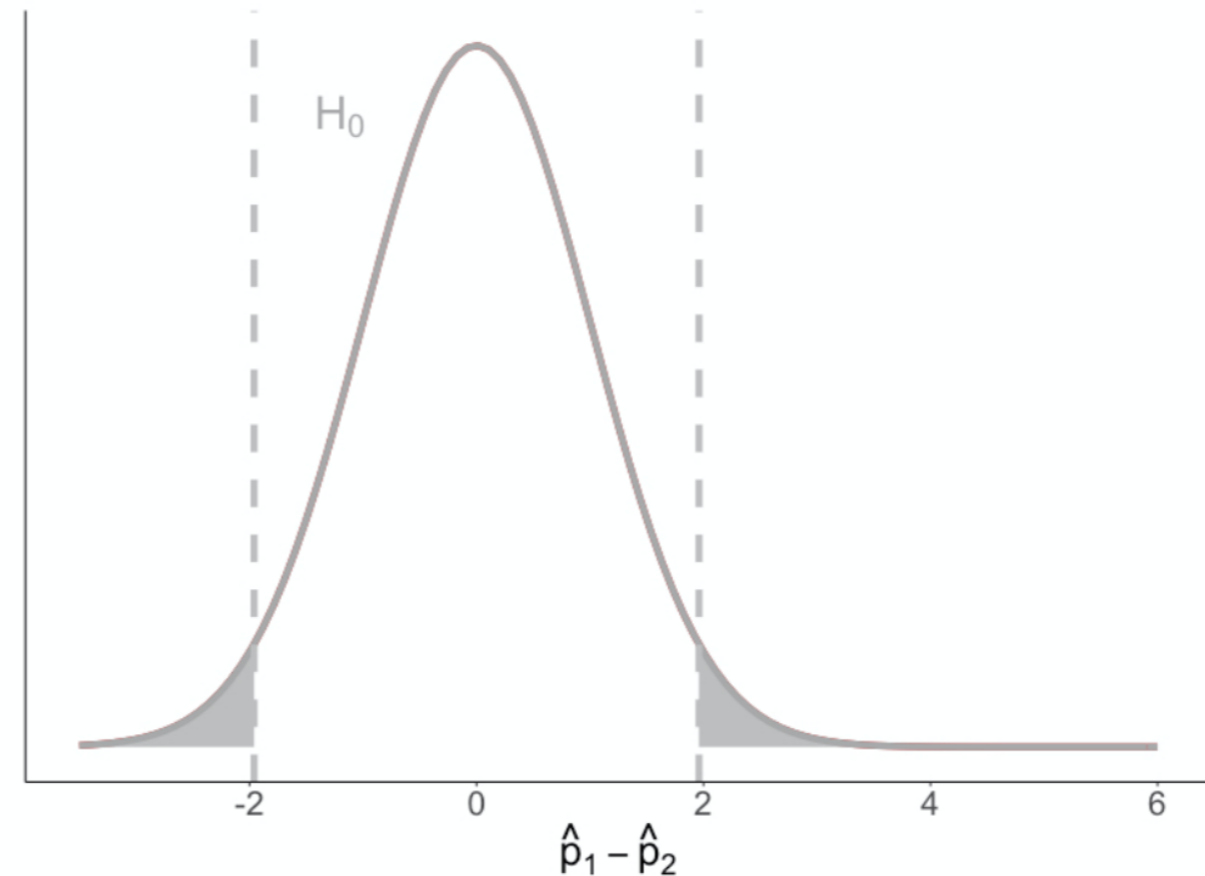
Decision

|           | H0 true            | H0 false |
|-----------|--------------------|----------|
| retain H0 | OK                 | Type II  |
| reject H0 | Type I<br>$\alpha$ | OK       |

What is the probability that you will fail to reject a false null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$





# Statistical Errors

Truth

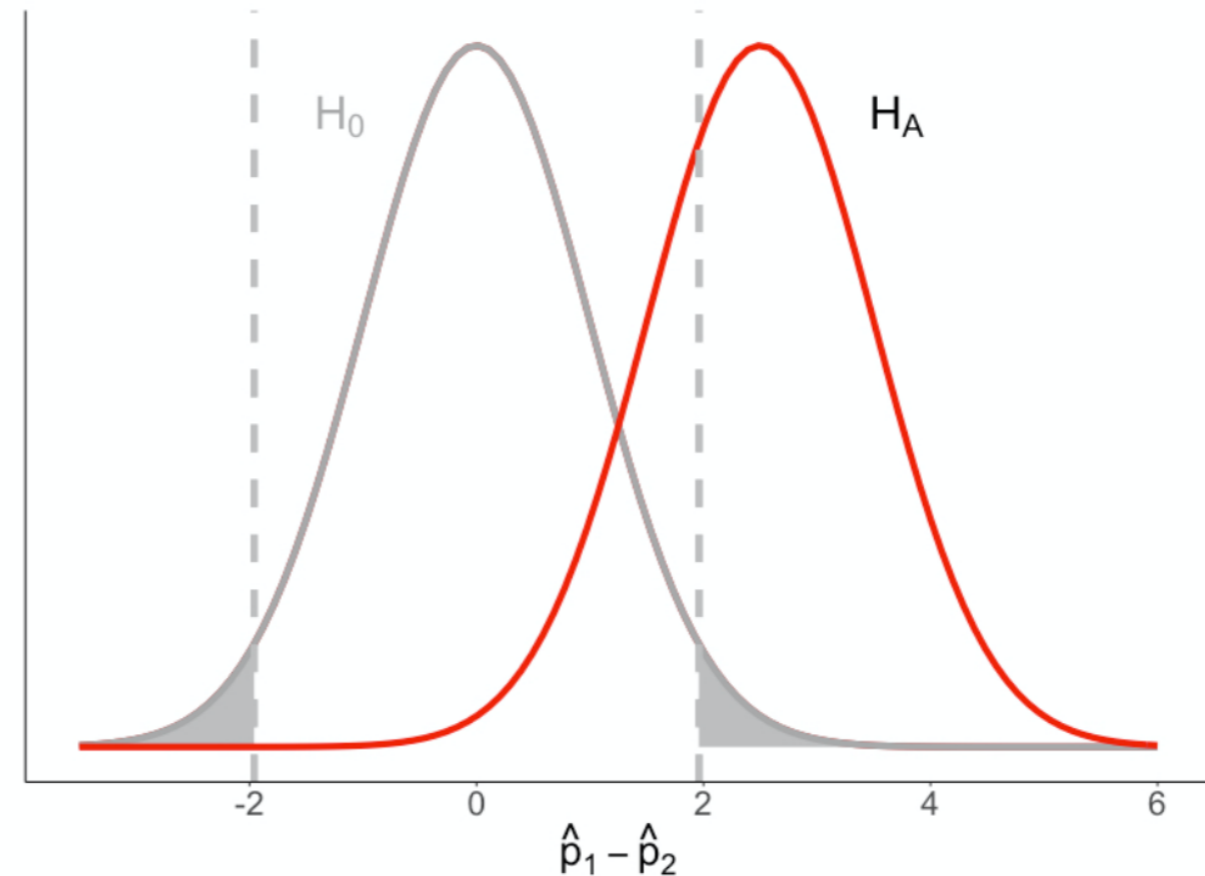
Decision

|           | H0 true            | H0 false |
|-----------|--------------------|----------|
| retain H0 | OK                 | Type II  |
| reject H0 | Type I<br>$\alpha$ | OK       |

What is the probability that you will fail to reject a false null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Statistical Errors

Truth

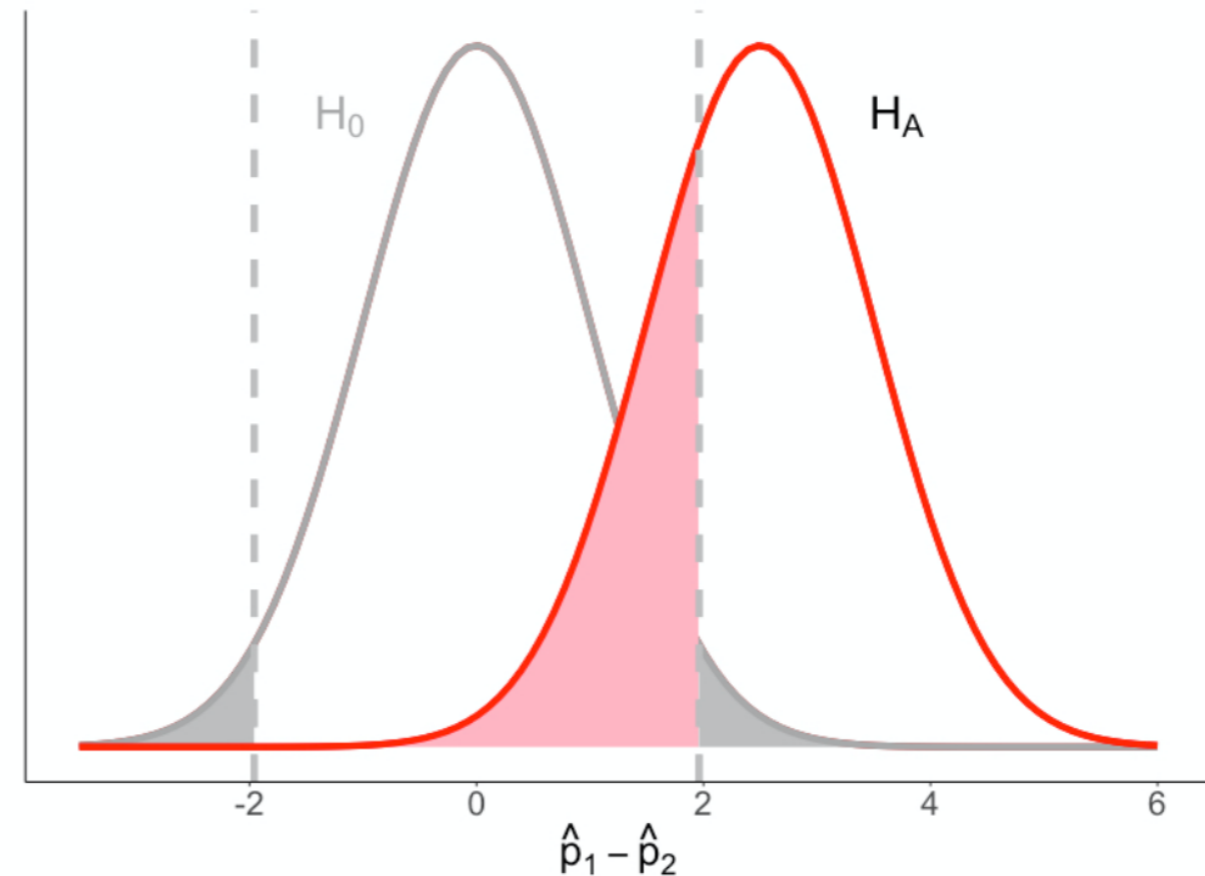
Decision

|           | H0 true            | H0 false |
|-----------|--------------------|----------|
| retain H0 | OK                 | Type II  |
| reject H0 | Type I<br>$\alpha$ | OK       |

What is the probability that you will fail to reject a false null hypothesis?

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Statistical Errors

Truth

Decision

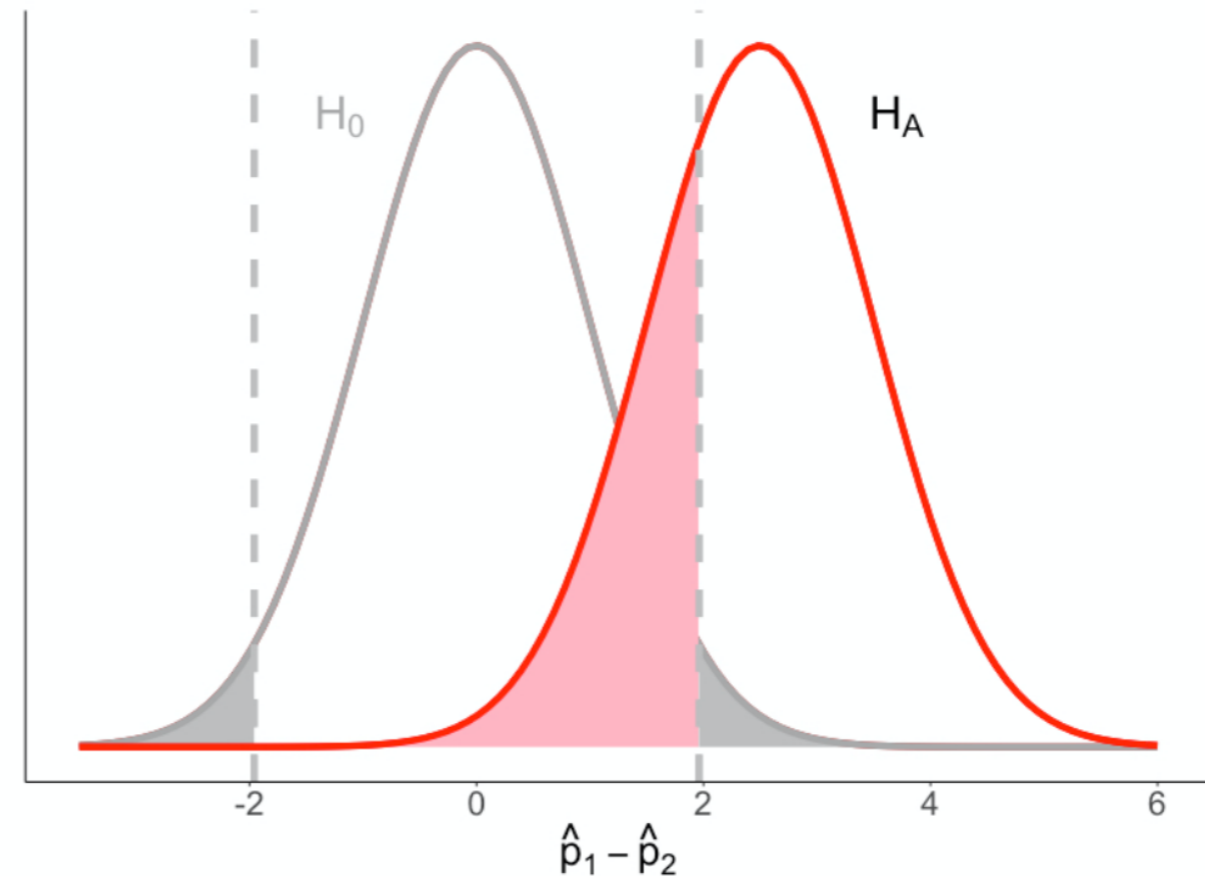
|           | H0 true            | H0 false           |
|-----------|--------------------|--------------------|
| retain H0 | OK                 | Type II<br>$\beta$ |
| reject H0 | Type I<br>$\alpha$ | OK                 |

What is the probability that you will fail to reject a false null hypothesis?

$\beta$

$$H_0 : p_1 - p_2 = 0$$

$$H_A : p_1 - p_2 \neq 0$$



# Let's practice!

INFERENCE FOR CATEGORICAL DATA IN R