

QUANTITATIVE ANALYSIS

DIFFERENCE OF MEANS (1)

AGENDA

1. Follow-up
2. Revisiting Distributions
3. One Sample
4. Independent Samples
5. Dependent Samples
6. Effect Sizes

1 FOLLOW-UP

2 REVISITING DISTRIBUTIONS

VARIANCE

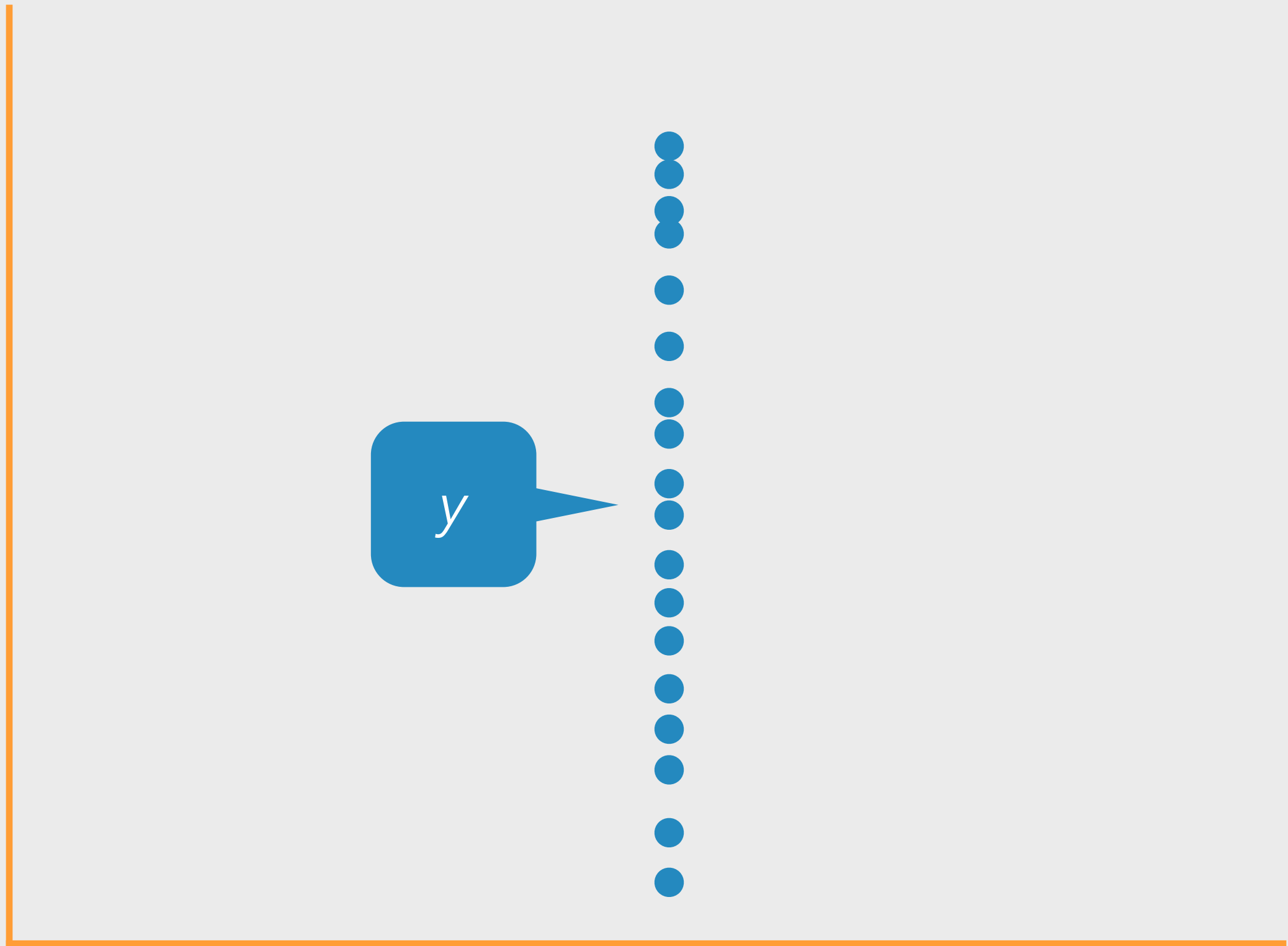
SECOND
MOMENT

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

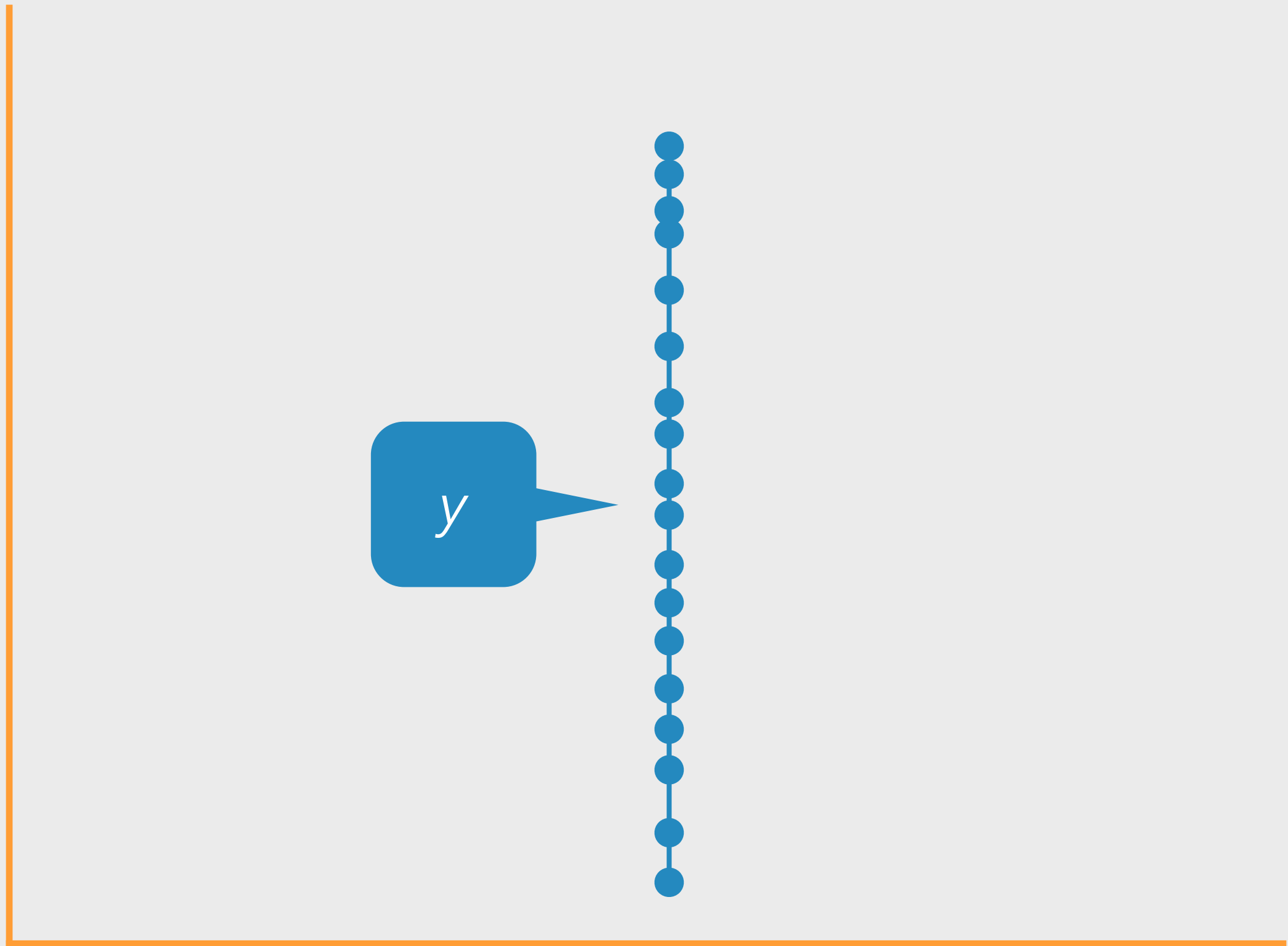
DEFINITION

SUM OF ALL DEVIANCES,
SQUARED AND DIVIDED BY
ONE DEGREE OF FREEDOM;
EXPECTATION OF HOW
DISTRIBUTION DEVIATES
FROM THE MEAN

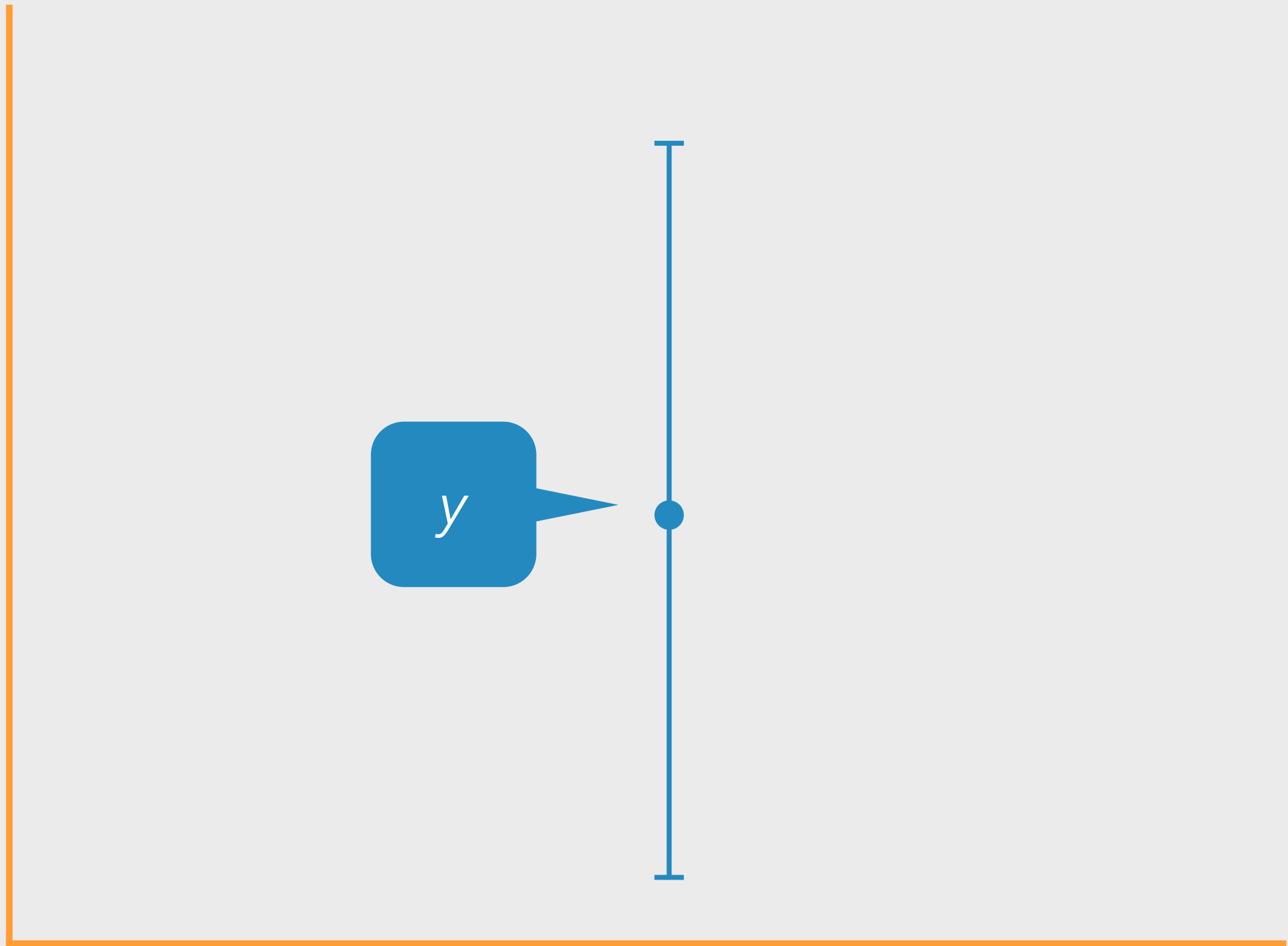
VARIANCE



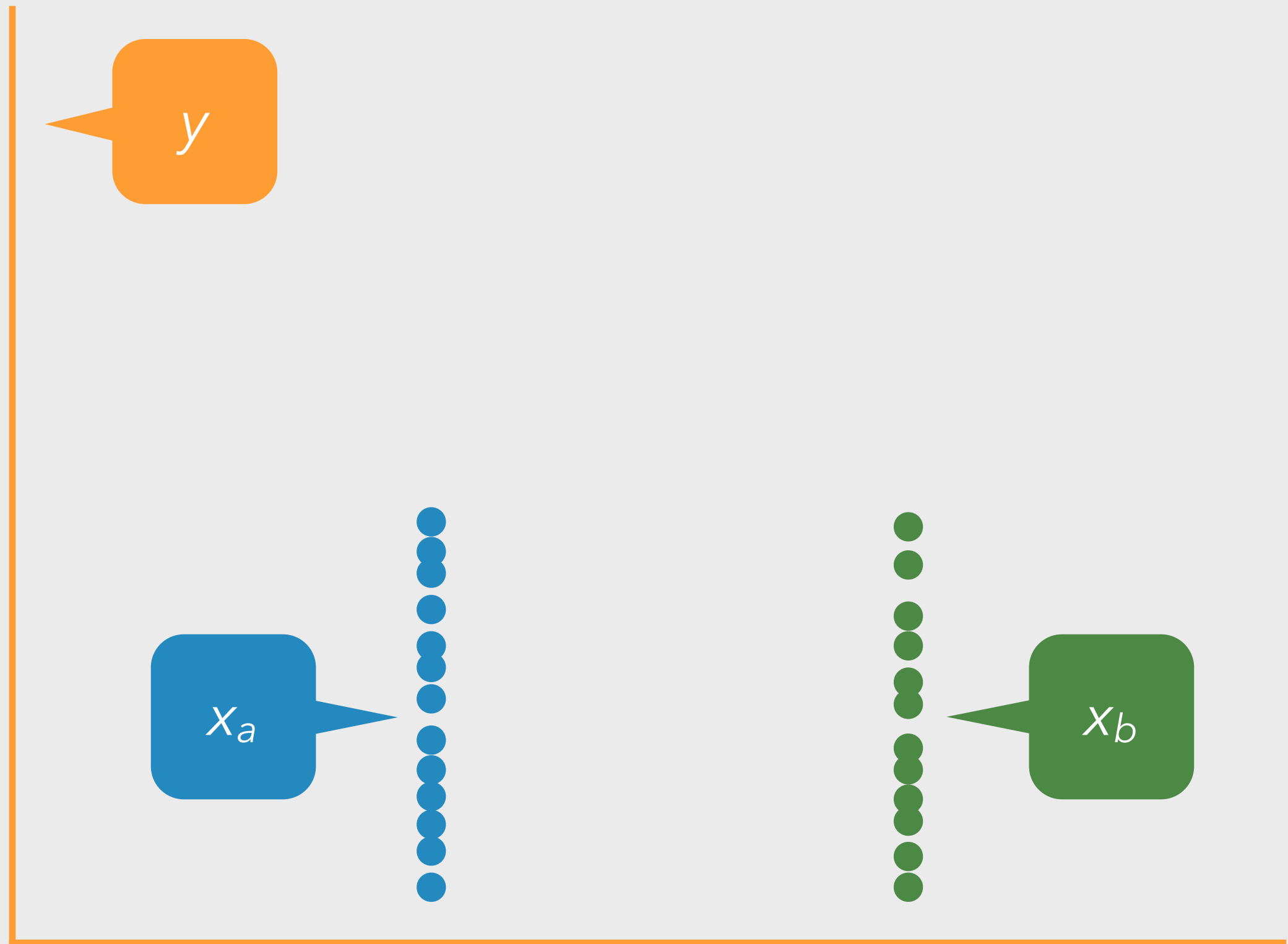
VARIANCE



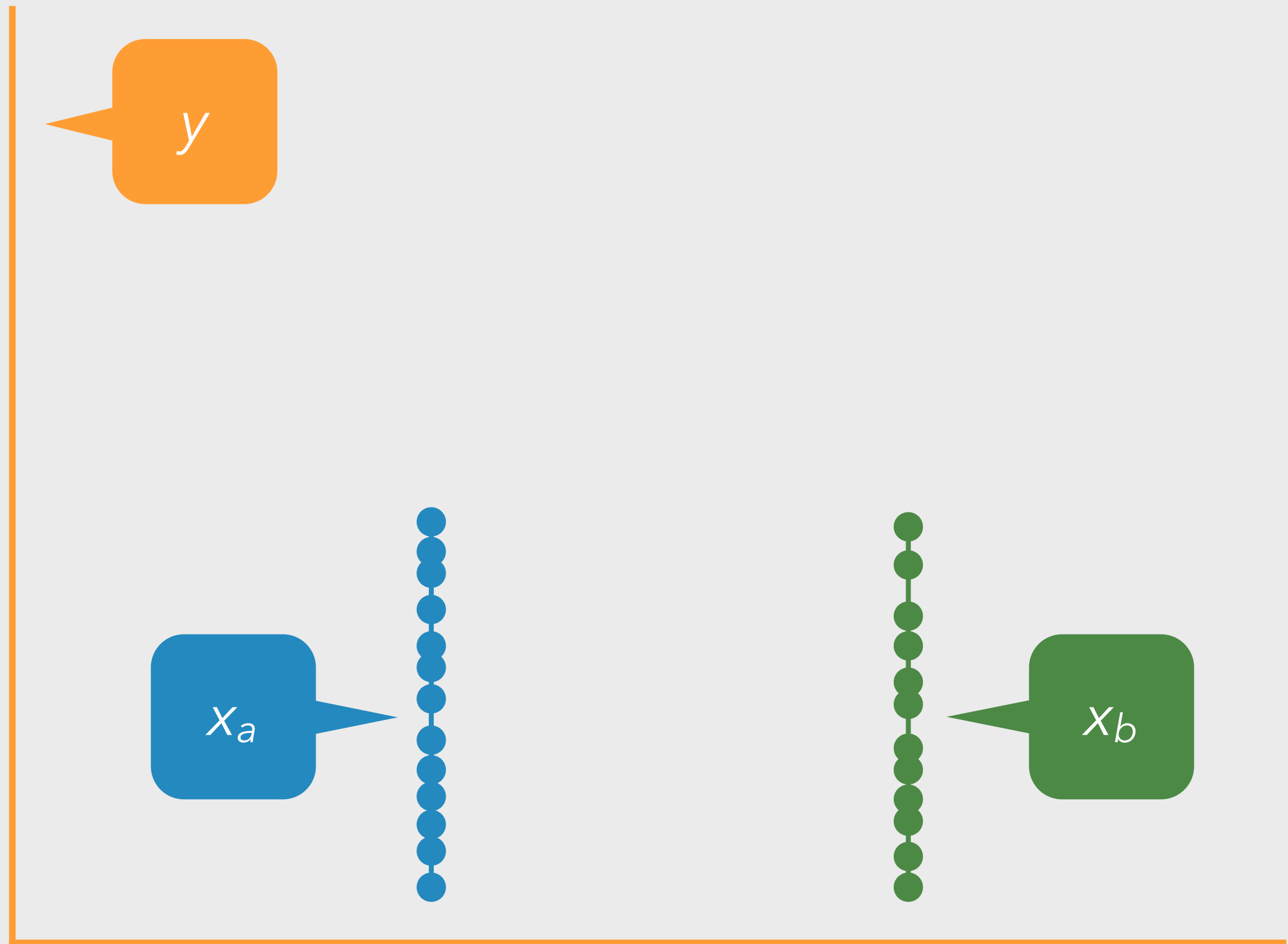
VARIANCE



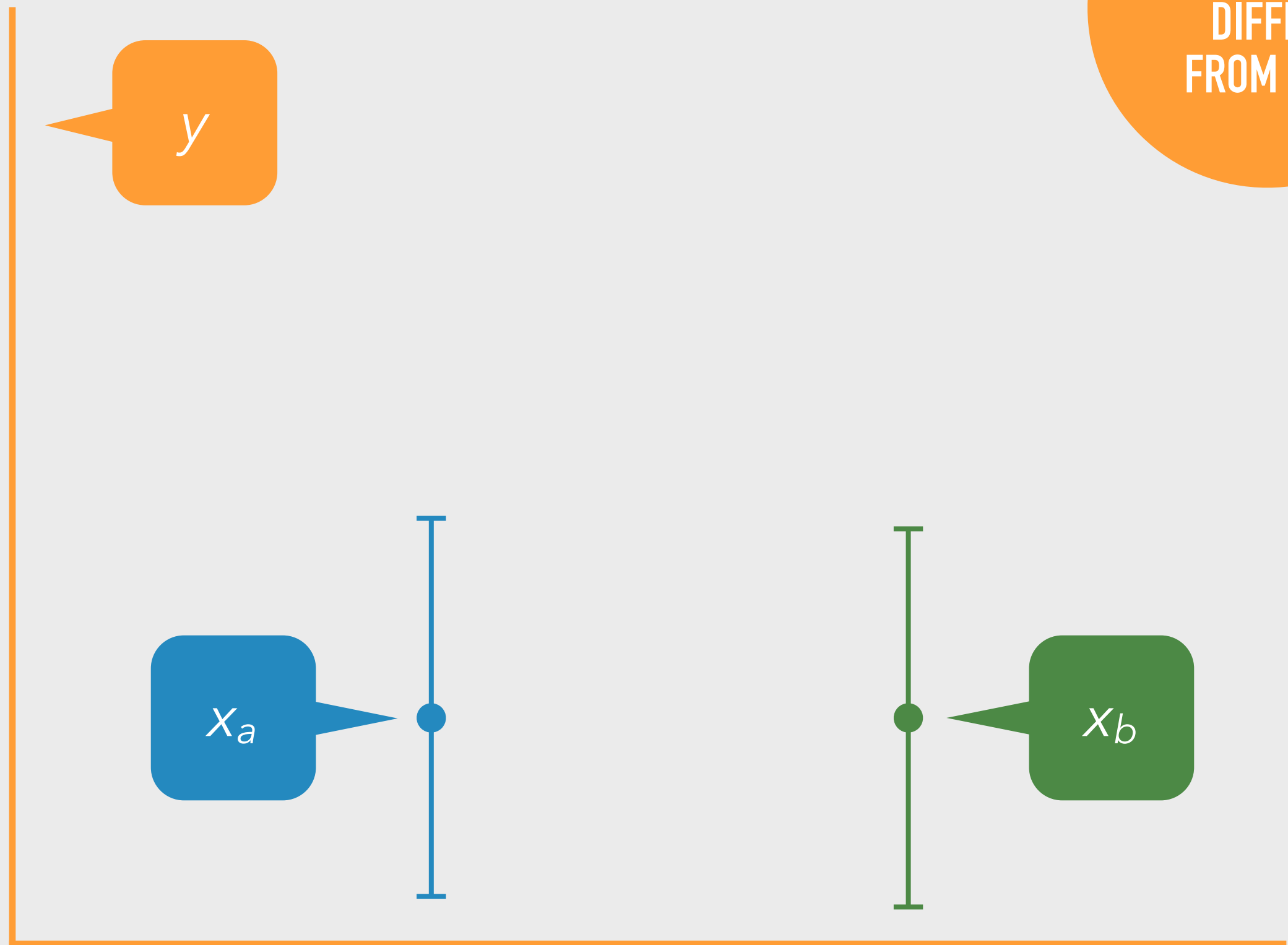
VARIANCE



VARIANCE

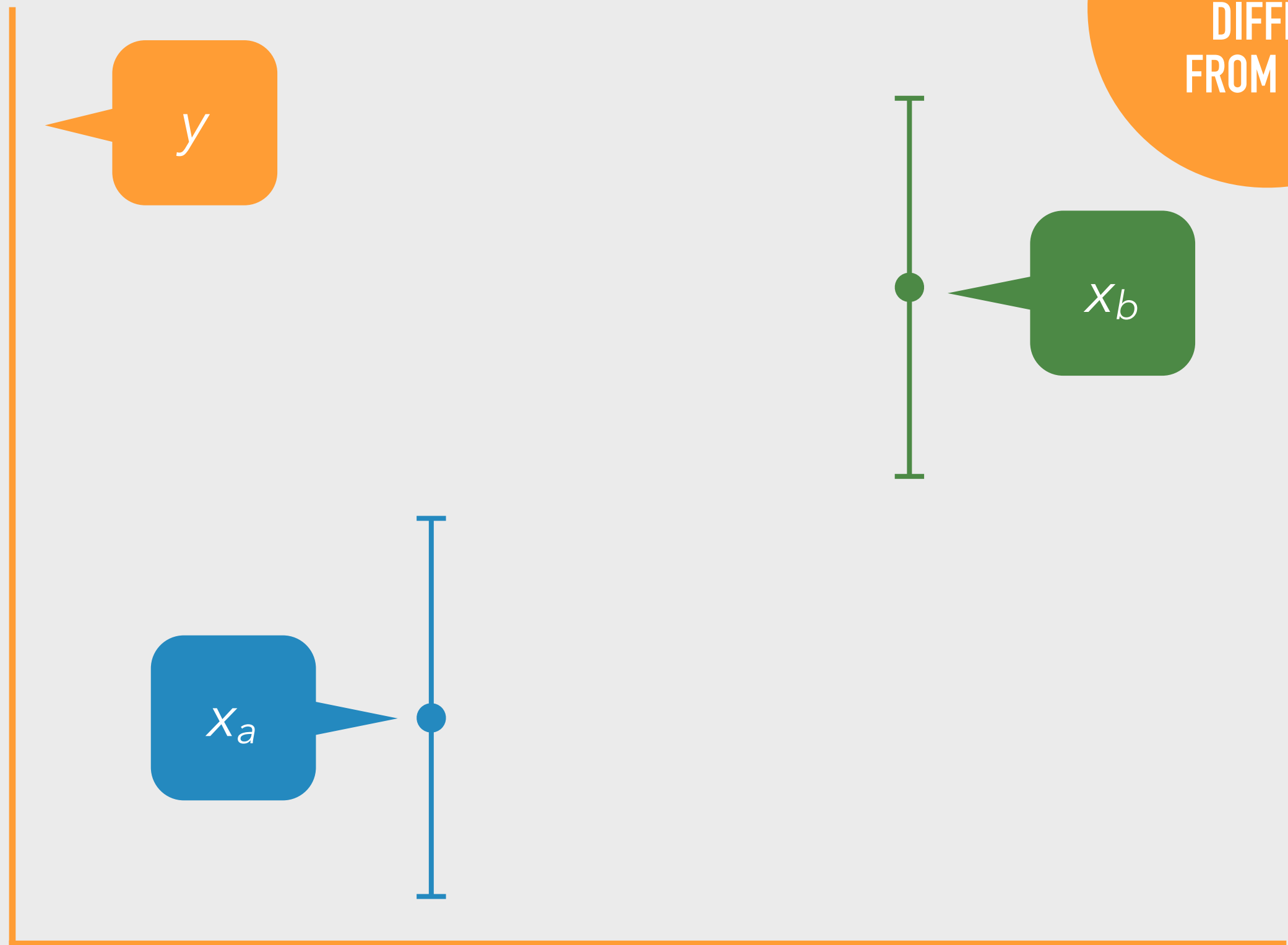


VARIANCE

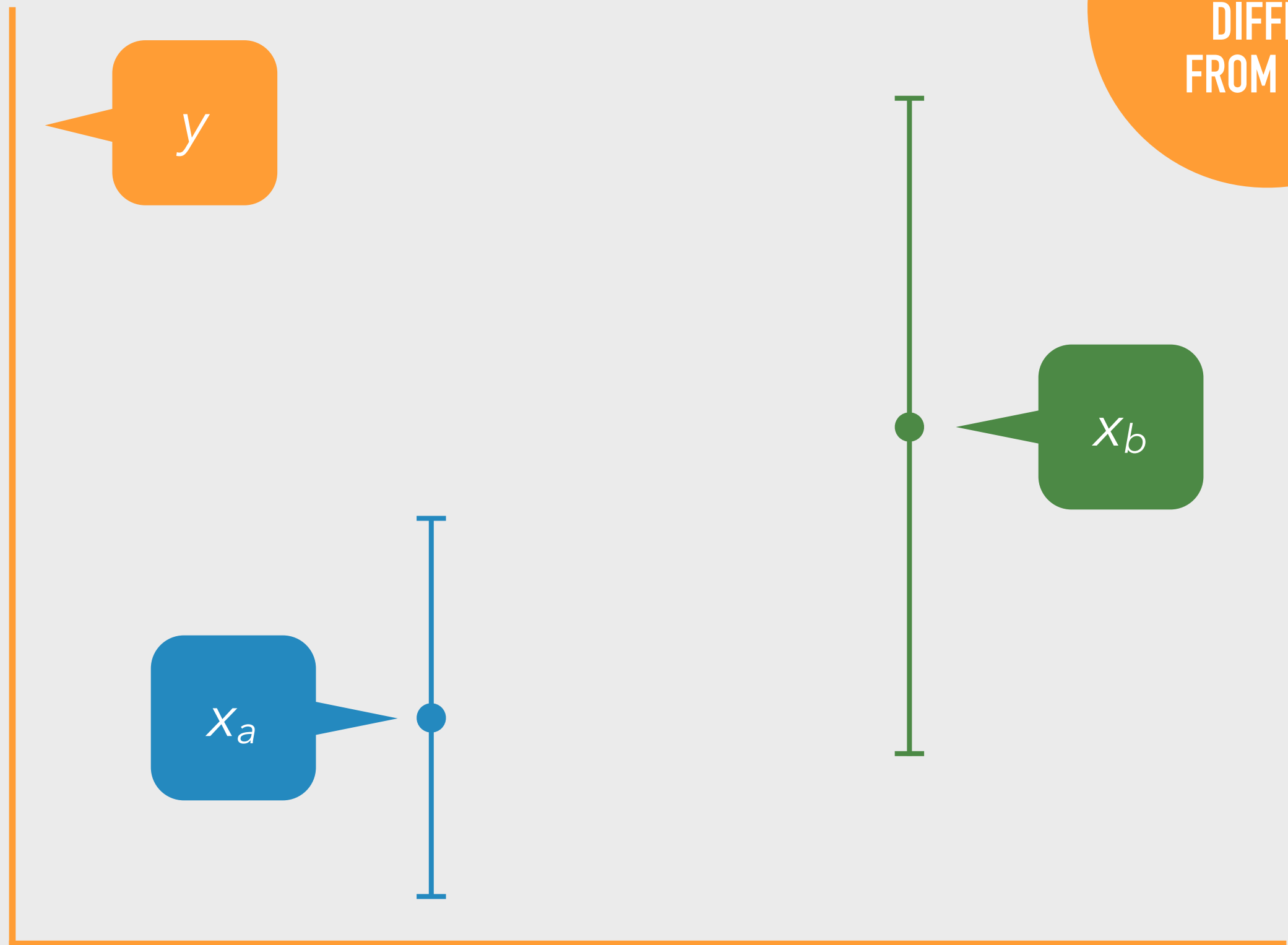


DOES THE
VARIANCE OF X_A
DIFFER
FROM X_B ?

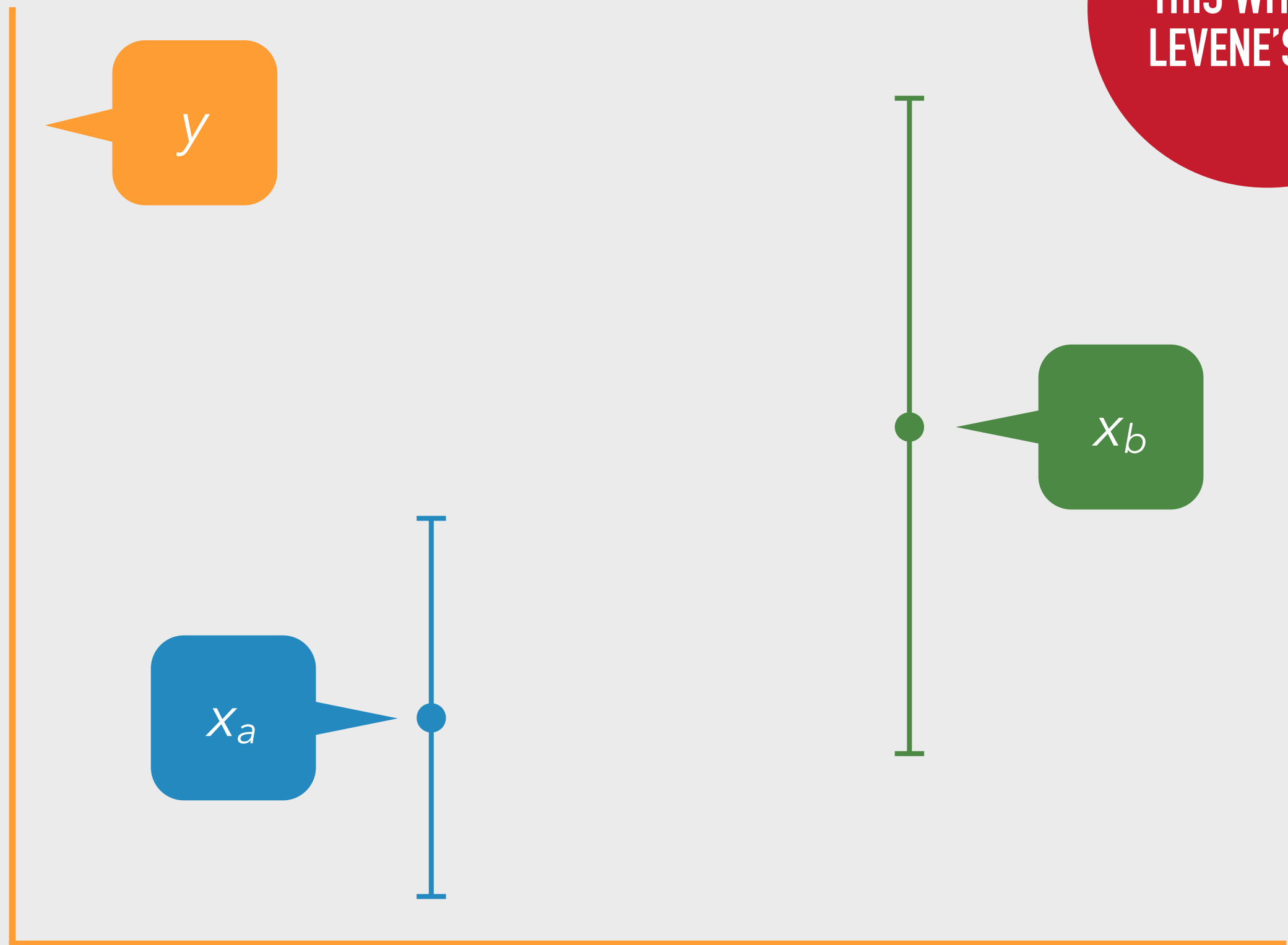
VARIANCE



VARIANCE



VARIANCE



WE CAN TEST
THIS WITH THE
LEVENE'S TEST

3 ONE SAMPLE

STUDENT'S T-TEST

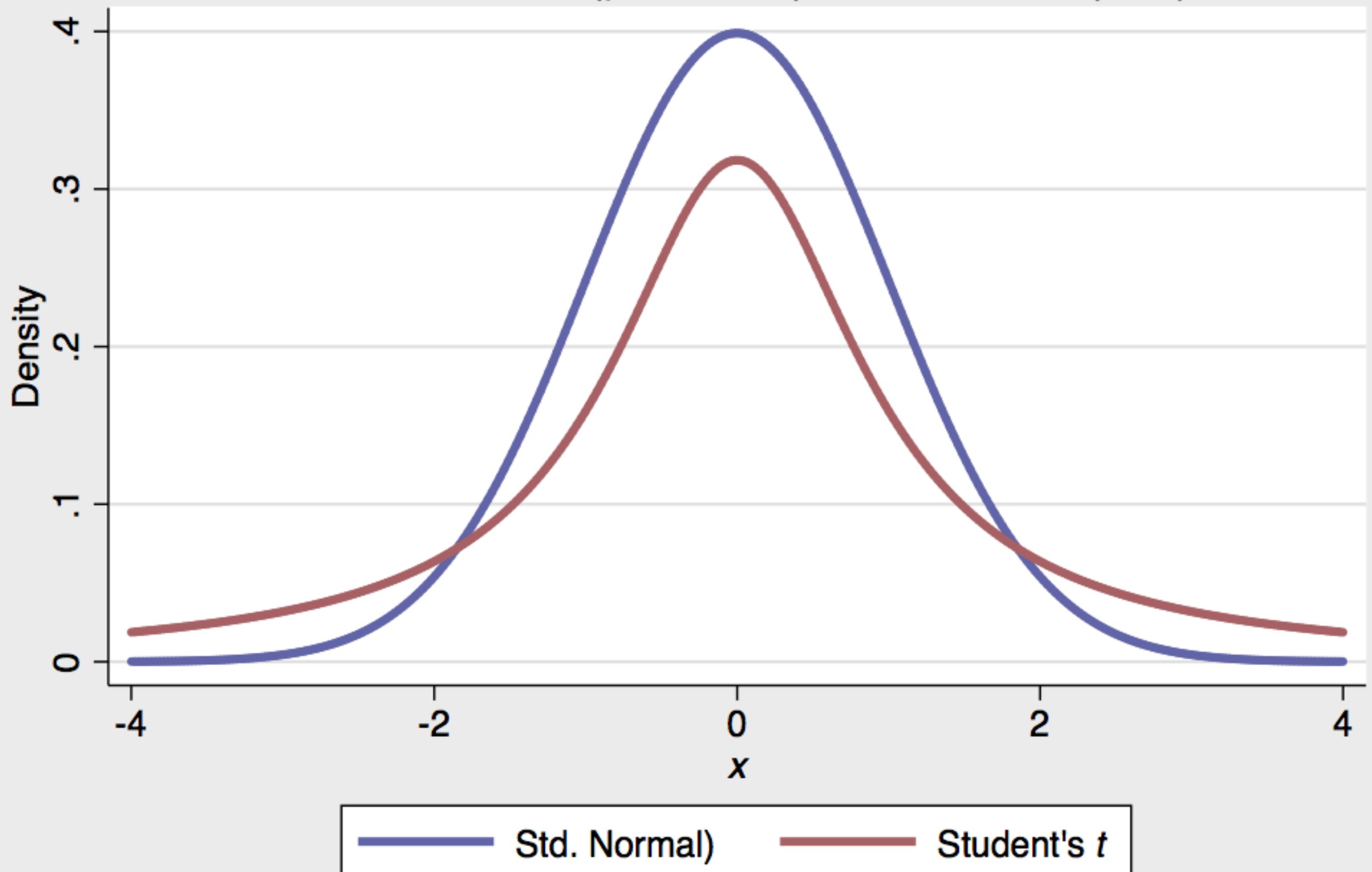
- ▶ Employee of the Guinness company who published his work under the pseudonym "Student".
- ▶ Student of Karl Pearson's while on research leaves from Guinness.
- ▶ Original t-tests were developed to conducting quality control testing on Guinness stout.

WILLIAM SEALY GOSSET (1876–1937)
"STUDENT"



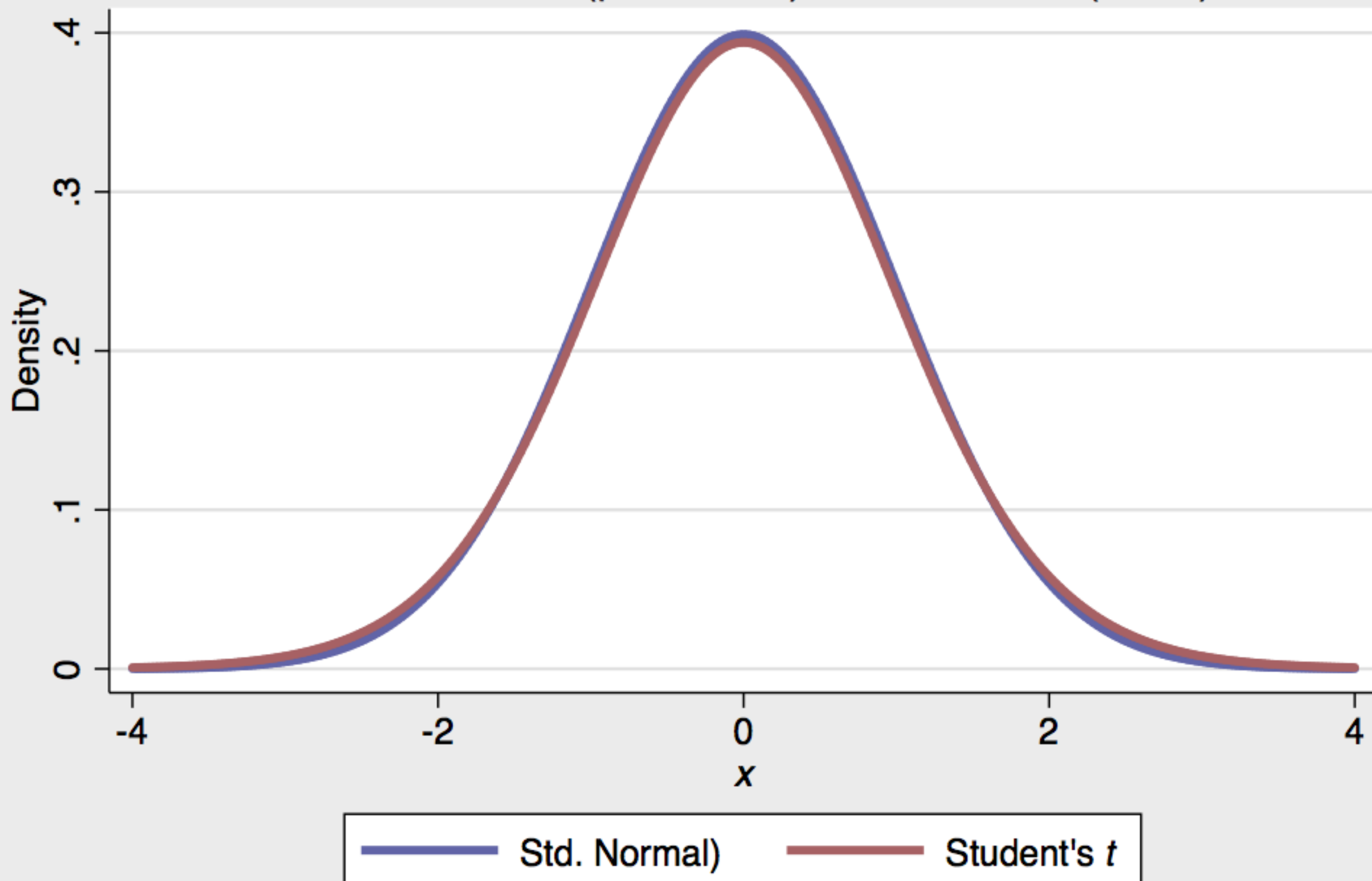
Probability Density Functions Compared

Standard Normal ($\mu=0$, $\sigma=1.0$) and Student's t ($df=1$)



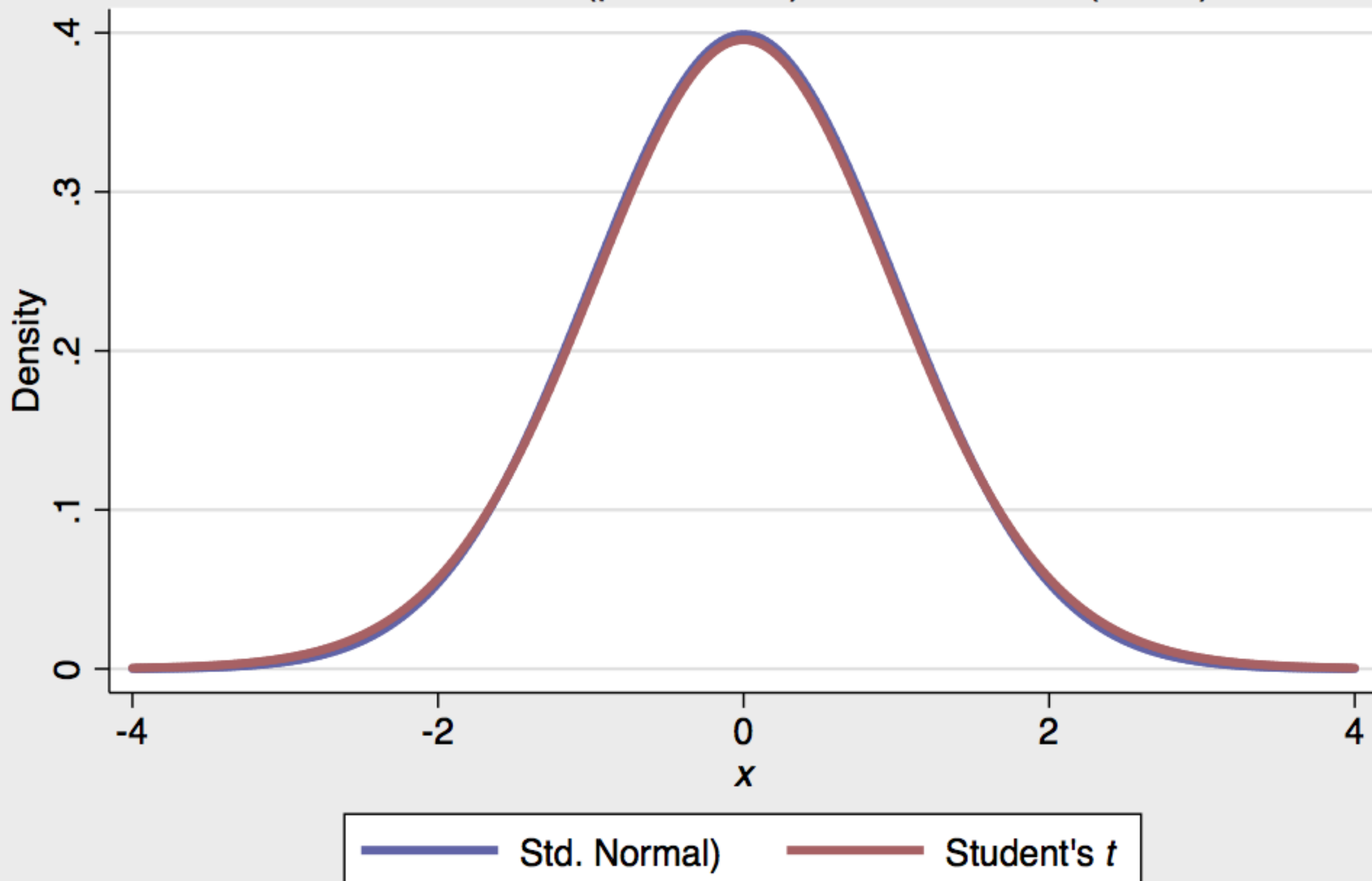
Probability Density Functions Compared

Standard Normal ($\mu=0$, $\sigma=1.0$) and Student's t ($df=20$)



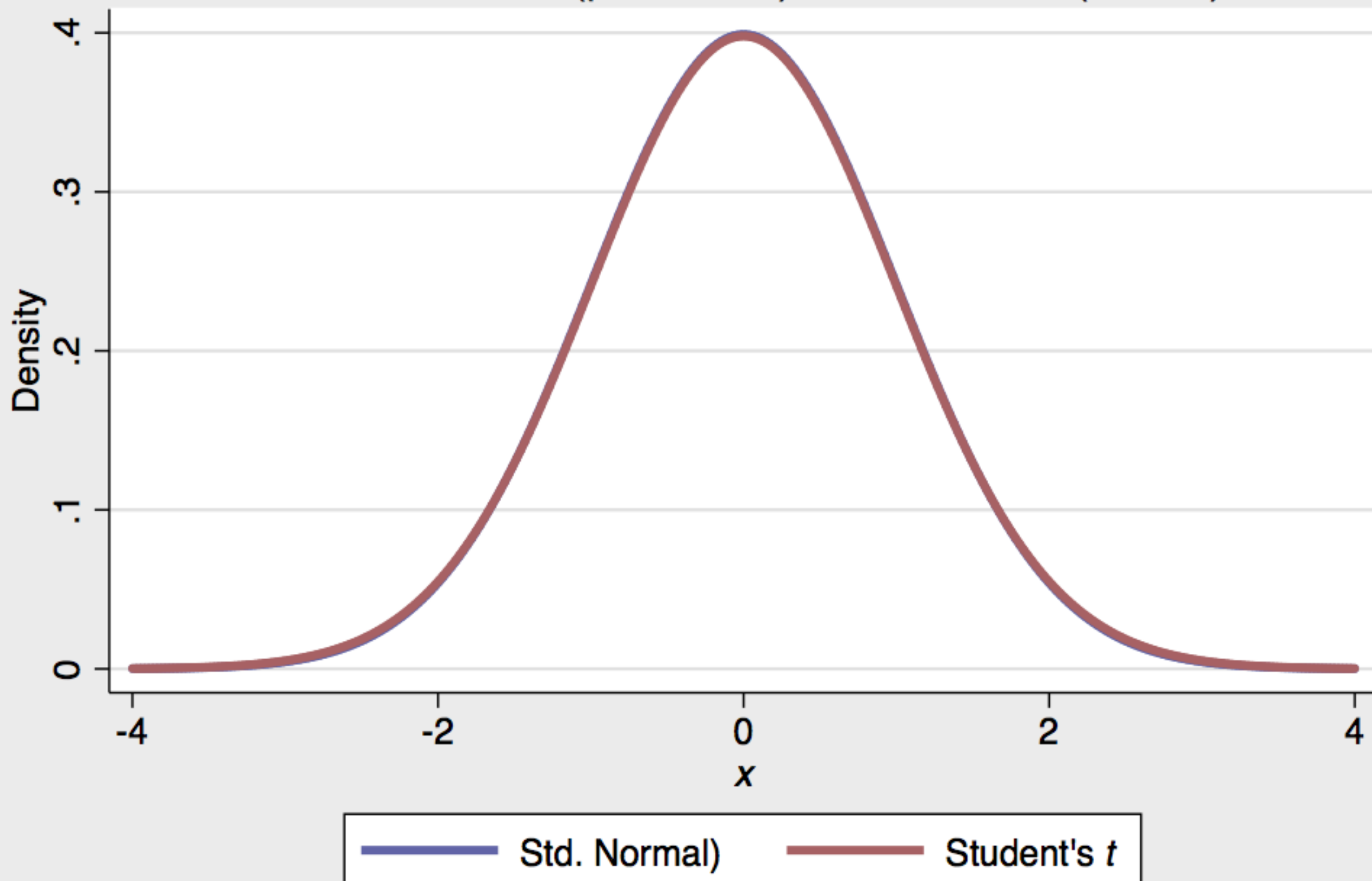
Probability Density Functions Compared

Standard Normal ($\mu=0$, $\sigma=1.0$) and Student's t ($df=30$)



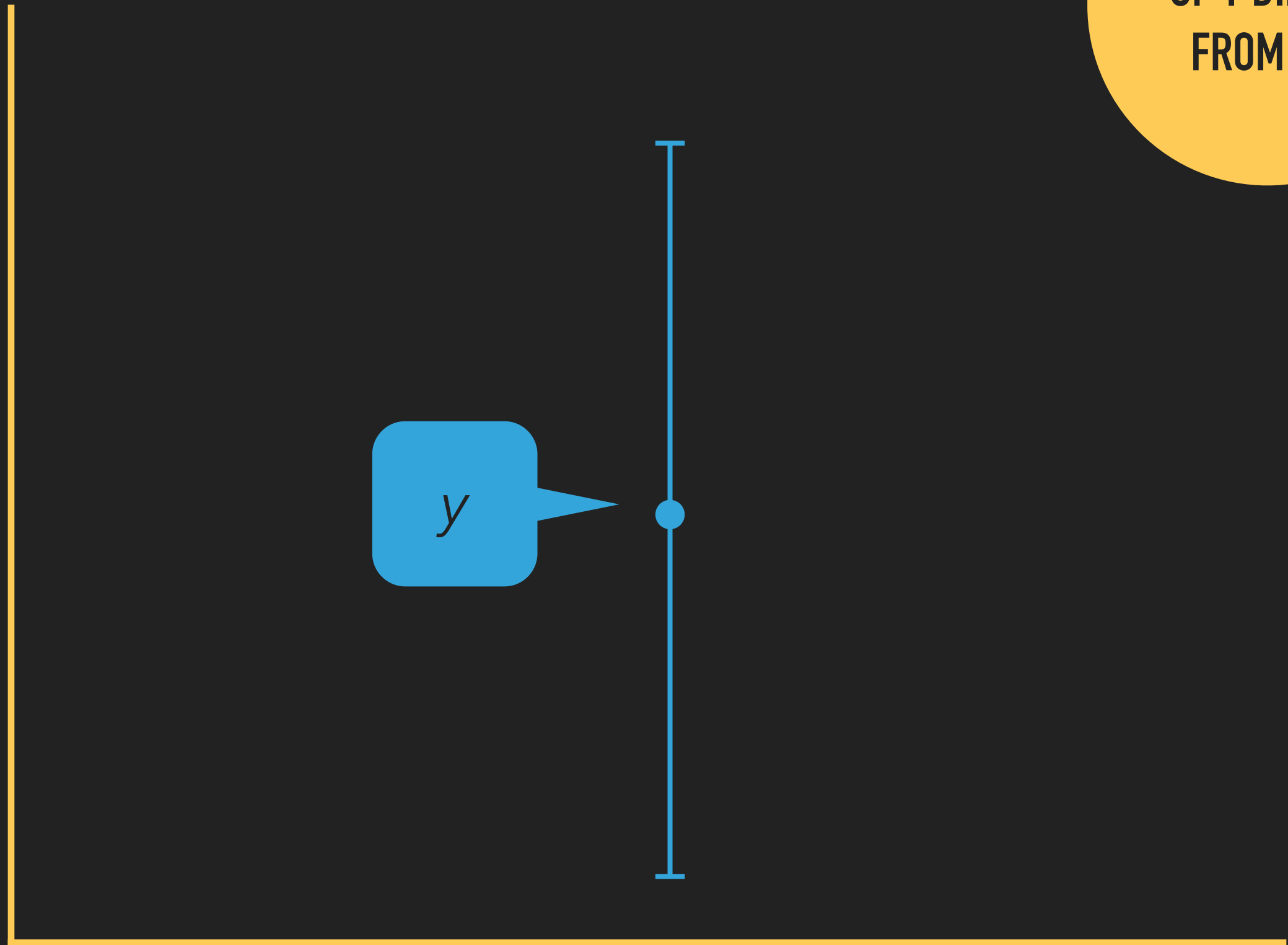
Probability Density Functions Compared

Standard Normal ($\mu=0$, $\sigma=1.0$) and Student's t ($df=100$)



DIFFERENCE IN MEANS

DOES THE MEAN
OF Y DIFFER
FROM μ ?



HYPOTHESES

- ▶ H_0 = there is no significant difference between the mean of y and the population
- ▶ H_1 = there is a significant difference between the mean of y and the population

ASSUMPTIONS

- ▶ continuous data (y)
- ▶ the distribution of y is approximately normal
- ▶ degrees of freedom (ν) = $n-1$

FORMULA

$$t = \frac{\bar{x} - \mu}{\frac{s}{\sqrt{n}}}$$

standard error

3. INDEPENDENT SAMPLES

FIND THE PROBABILITY OF T

```
display ttail(df,t)*2
```

```
. display ttail(72,3.6308)*2
```

```
.0005255
```

```
. display ttail(72,1.6308)*2
```

```
.1072996
```

3. INDEPENDENT SAMPLES

FIND THE PROBABILITY OF T

```
display (1-ttail(df,-t))*2
```

```
. display (1-ttail(72,-3.6308))*2
```

```
.0005255
```

```
. display (1-ttail(72,-1.6308))*2
```

```
.1072996
```

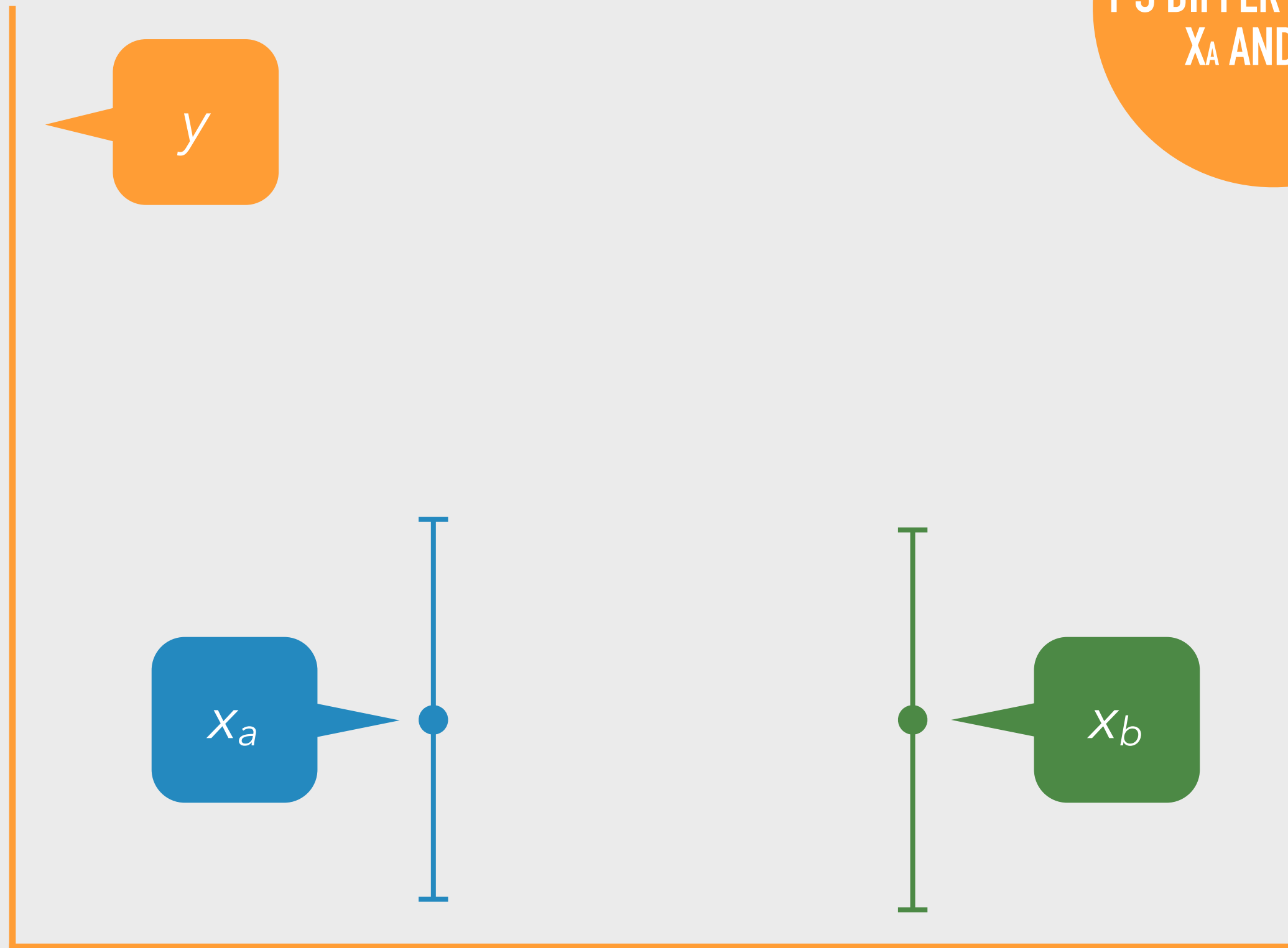
INTERPRETATION

- ▶ The one-sample t-test ($t=4.052, df=42, p<.001$) suggests that these data are not representative of the population. The sample mean of 45 is significantly different from the population mean of 60.

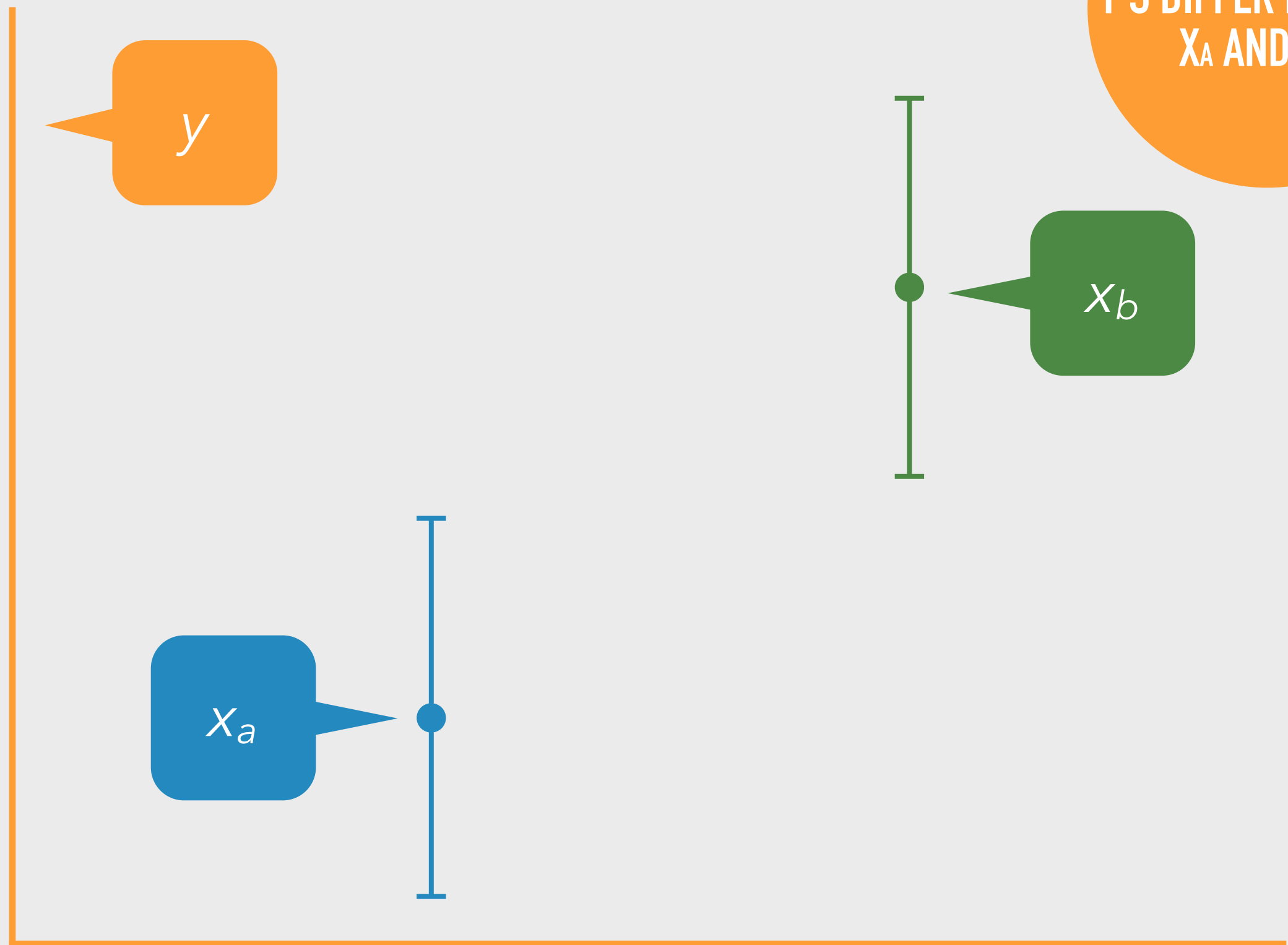
4 INDEPENDENT SAMPLES

DIFFERENCE OF MEANS

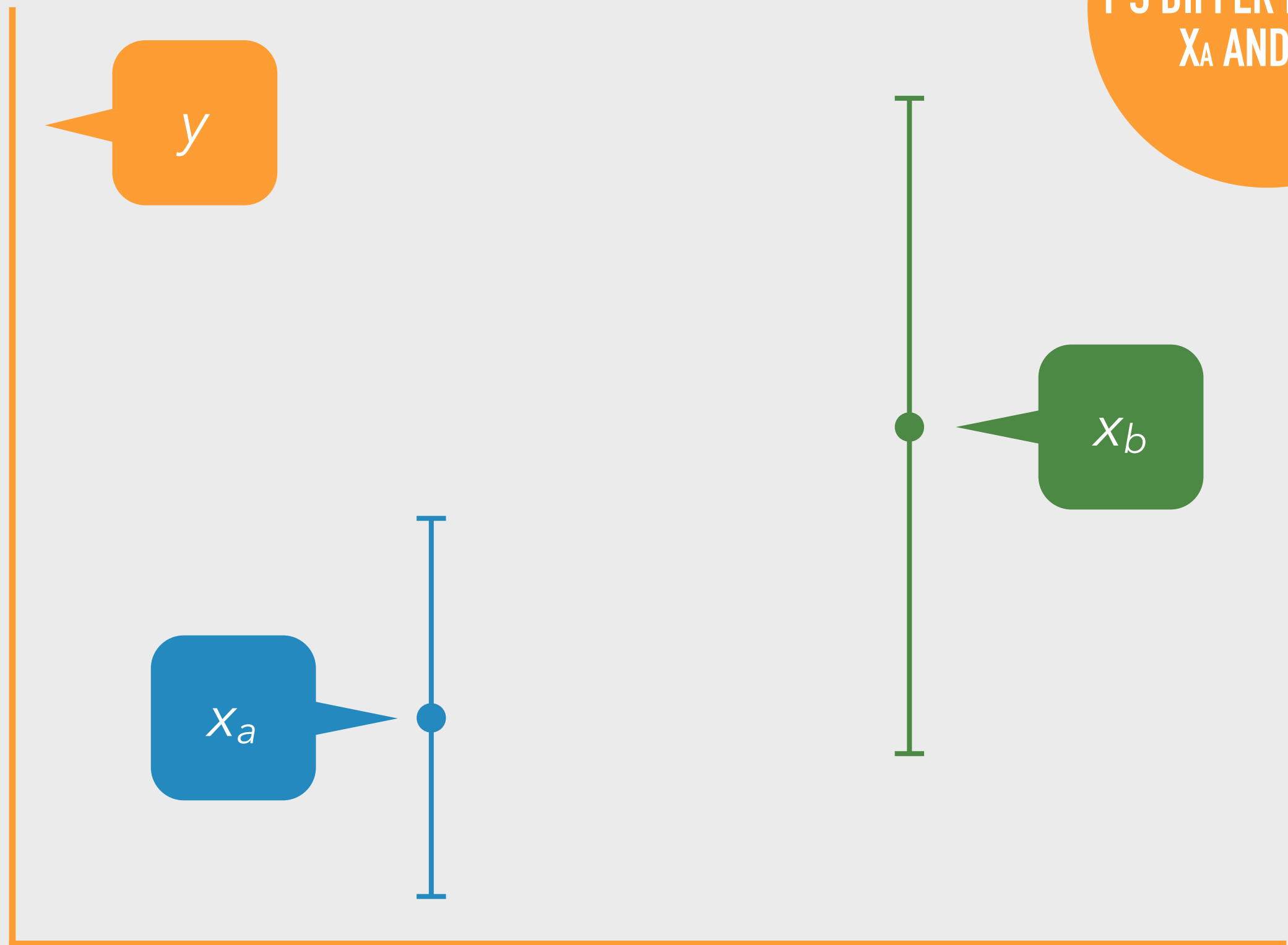
DO THE MEAN
Y'S DIFFER BETWEEN
 X_A AND X_B ?



DIFFERENCE OF MEANS

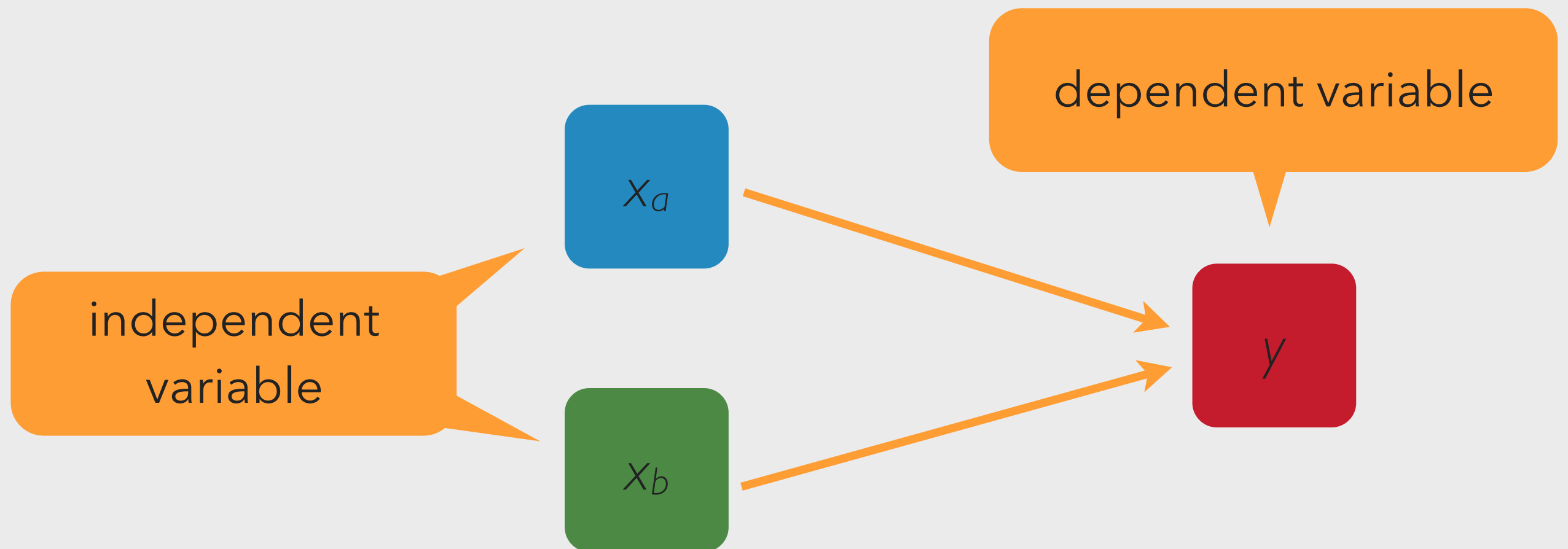


DIFFERENCE OF MEANS



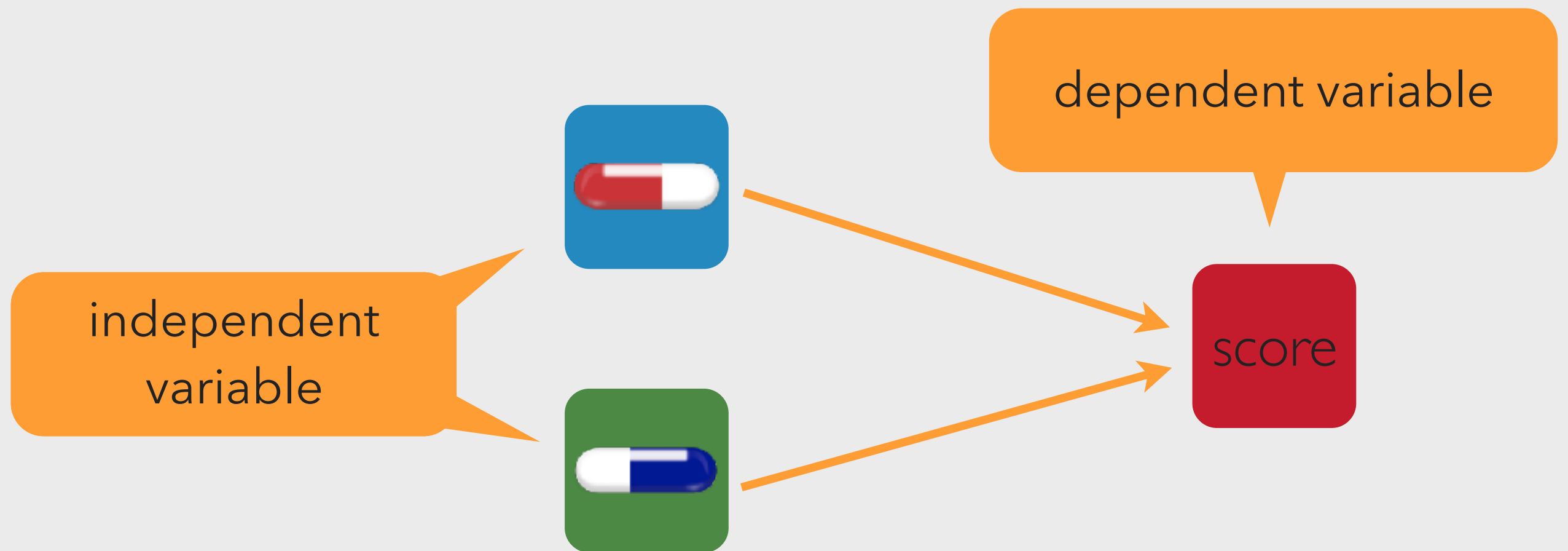
4. INDEPENDENT SAMPLES

MODEL



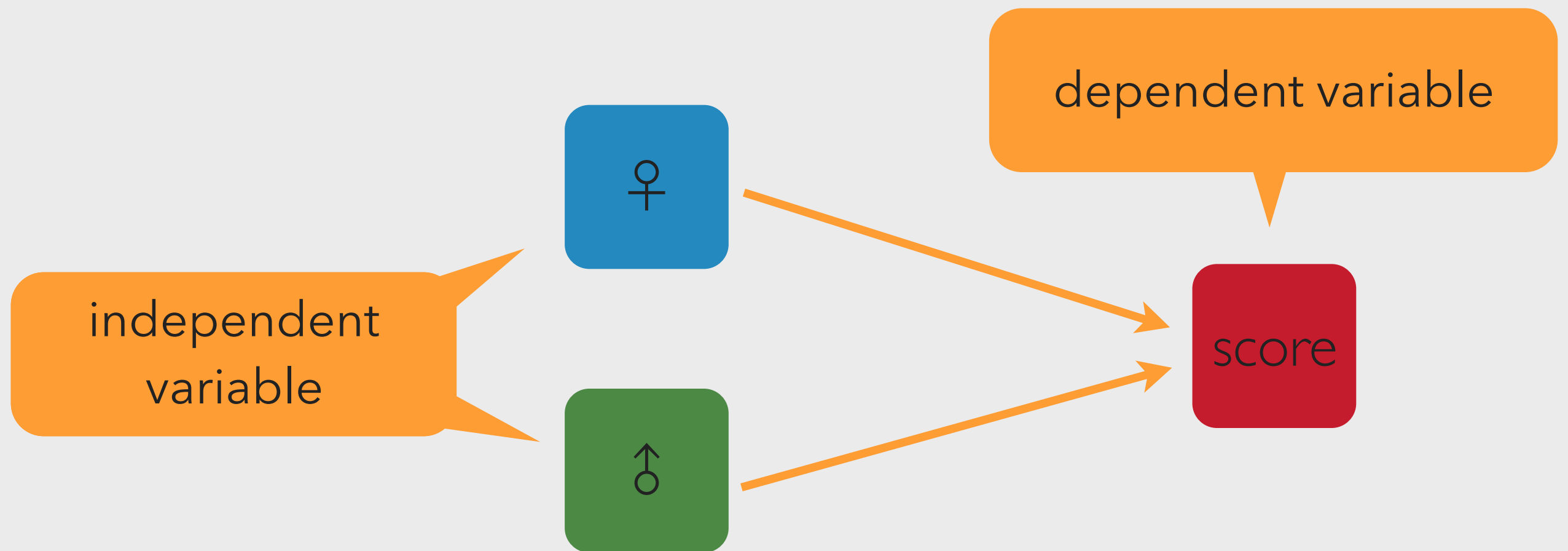
4. INDEPENDENT SAMPLES

MODEL



4. INDEPENDENT SAMPLES

MODEL



4. INDEPENDENT SAMPLES

HYPOTHESES

- ▶ H_0 = there is no difference in the mean of y between x_a and x_b
- ▶ H_1 = there is a difference in the mean of y between x_a and x_b

ASSUMPTIONS

- ▶ dependent variable (y) is continuous
- ▶ the distribution of y is approximately normal
- ▶ independent variable is binary (x_a and x_b)
- ▶ homogeneity of variance between x_a and x_b
- ▶ observations are independent
- ▶ $v = n_a + n_b - 2$

4. INDEPENDENT SAMPLES

EQUATION ASSUMING HOMOGENEITY OF VARIANCE

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

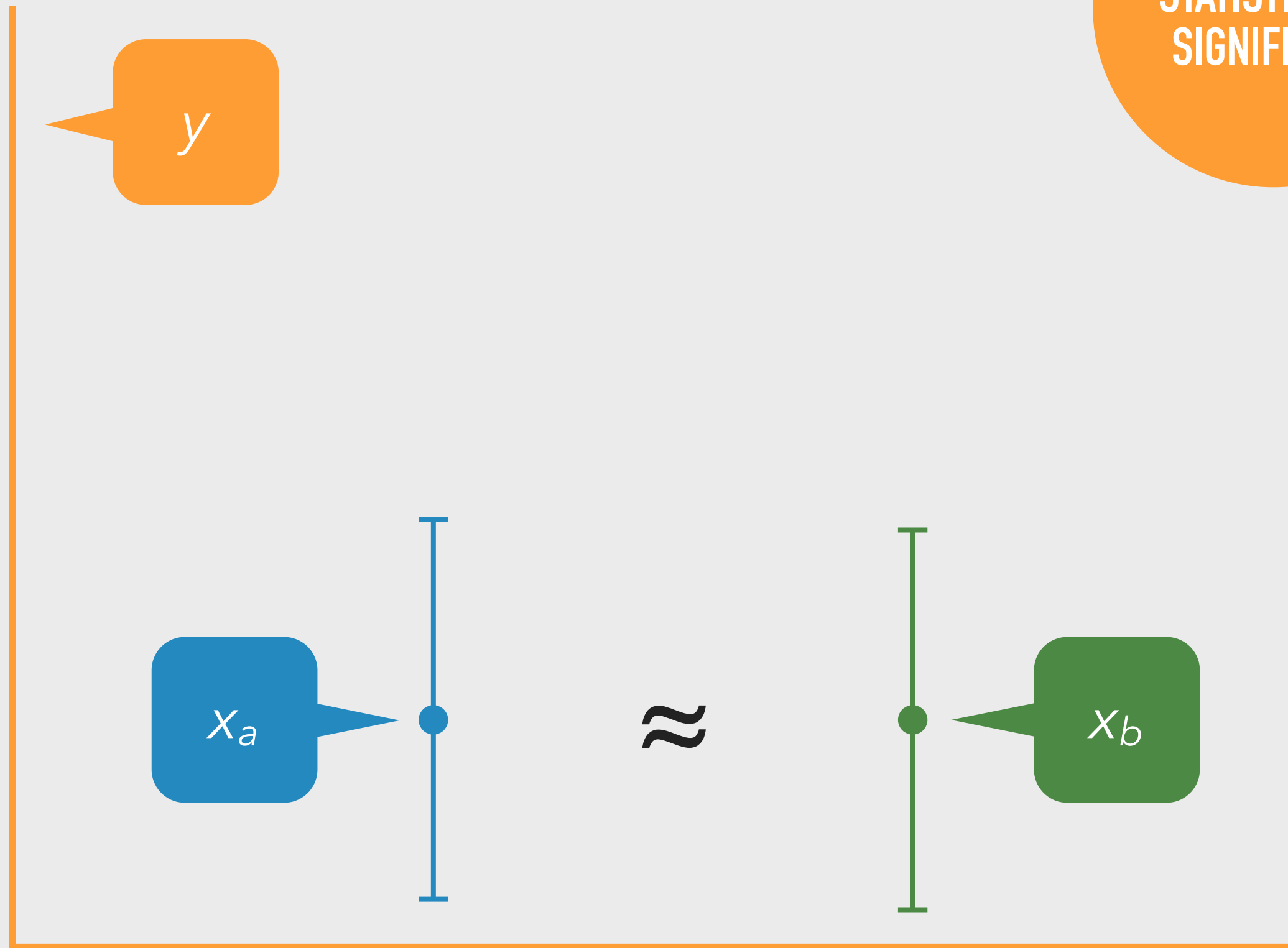
pooled variance

POOLED VARIANCE EQUATION

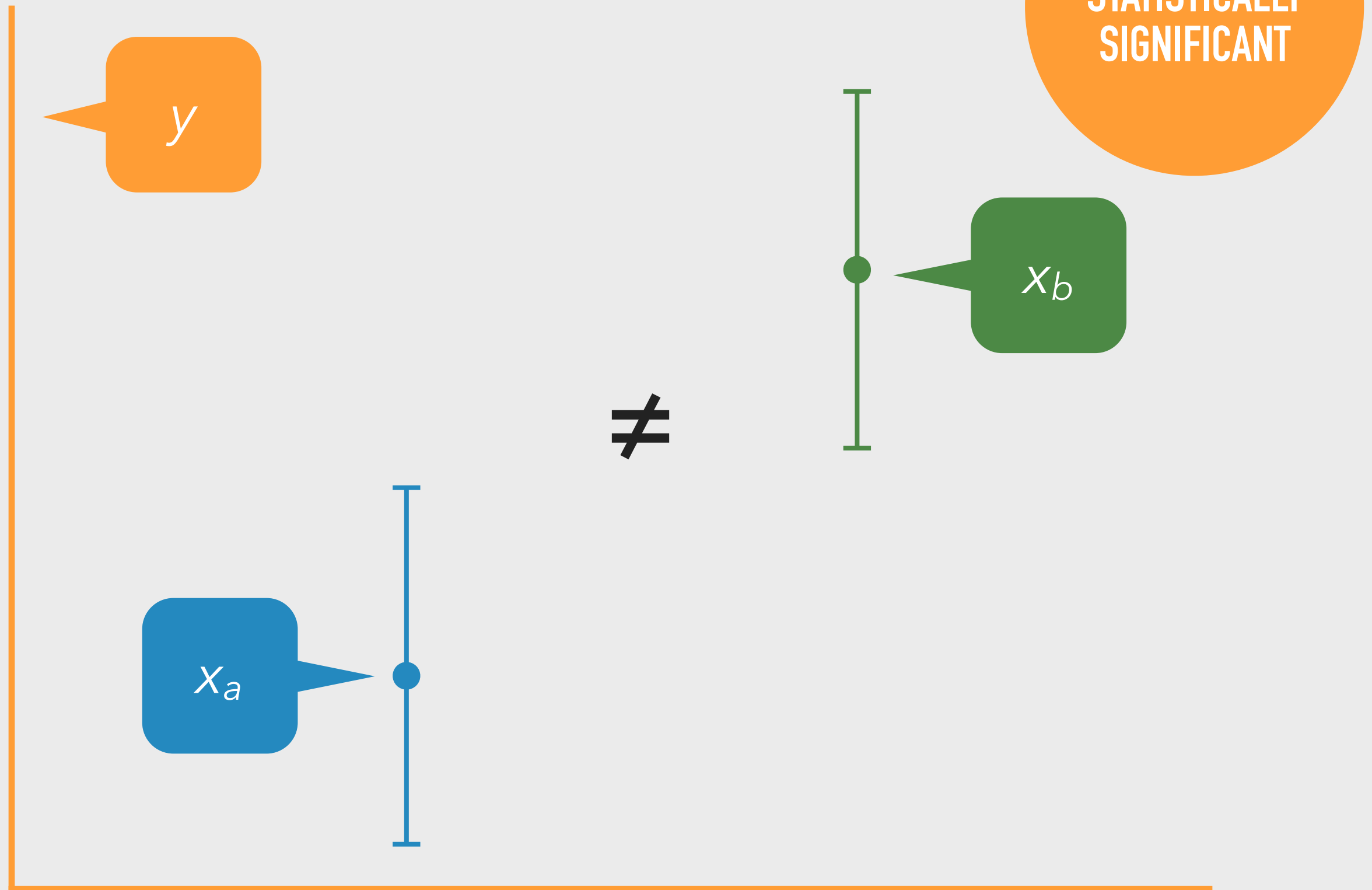
$$s_p^2 = \frac{(n_a - 1) s_a^2 + (n_b - 1) s_b^2}{n_a + n_b - 2}$$

DIFFERENCE OF MEANS

T-TEST IS **NOT**
STATISTICALLY
SIGNIFICANT

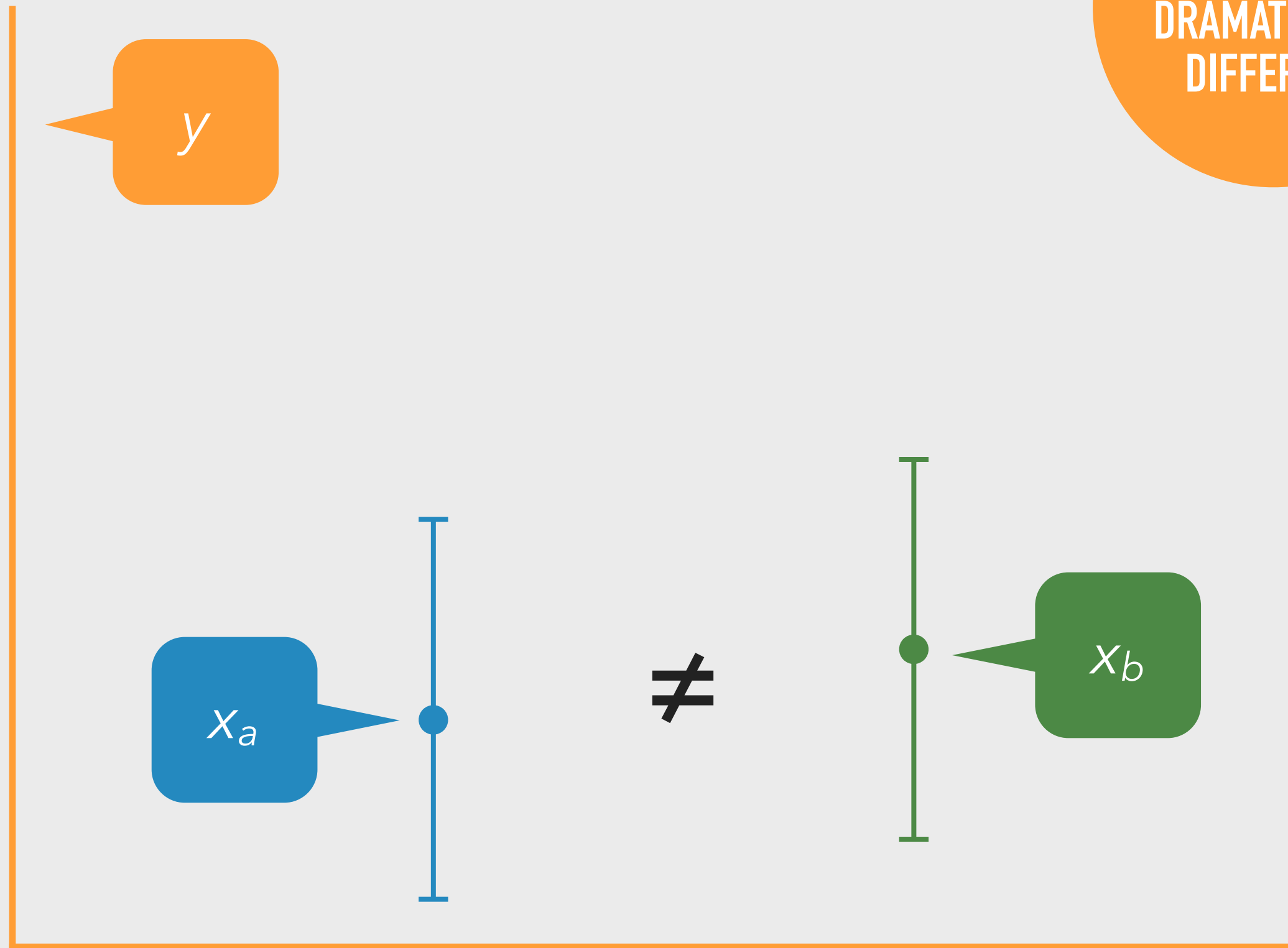


DIFFERENCE OF MEANS



DIFFERENCE OF MEANS

THE MEANS DO
NOT HAVE TO BE
DRAMATICALLY
DIFFERENT



ASSUMPTIONS

- ▶ dependent variable (y) is continuous
- ▶ the distribution of y is approximately normal
- ▶ independent variable is binary (x_a and x_b)
- ▶ homogeneity of variance between x_a and x_b
- ▶ observations are independent
- ▶ $v = n_a + n_b - 2$

EQUATION IF HOMOGENEITY OF VARIANCE CANNOT BE ASSUMED

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

variance values for
each subgroup

4. INDEPENDENT SAMPLES

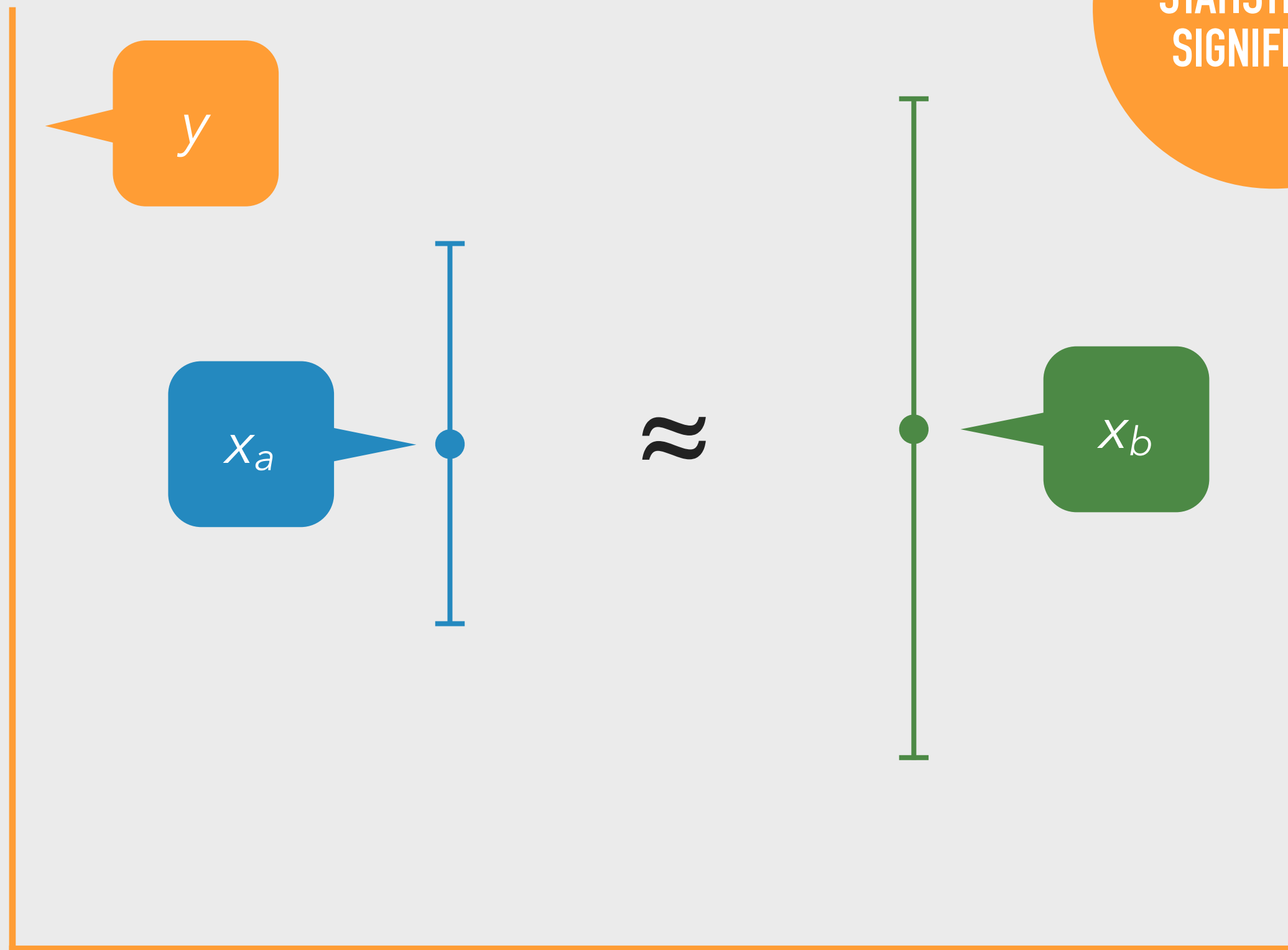
CAUTION! CAUTION! CAUTION!

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

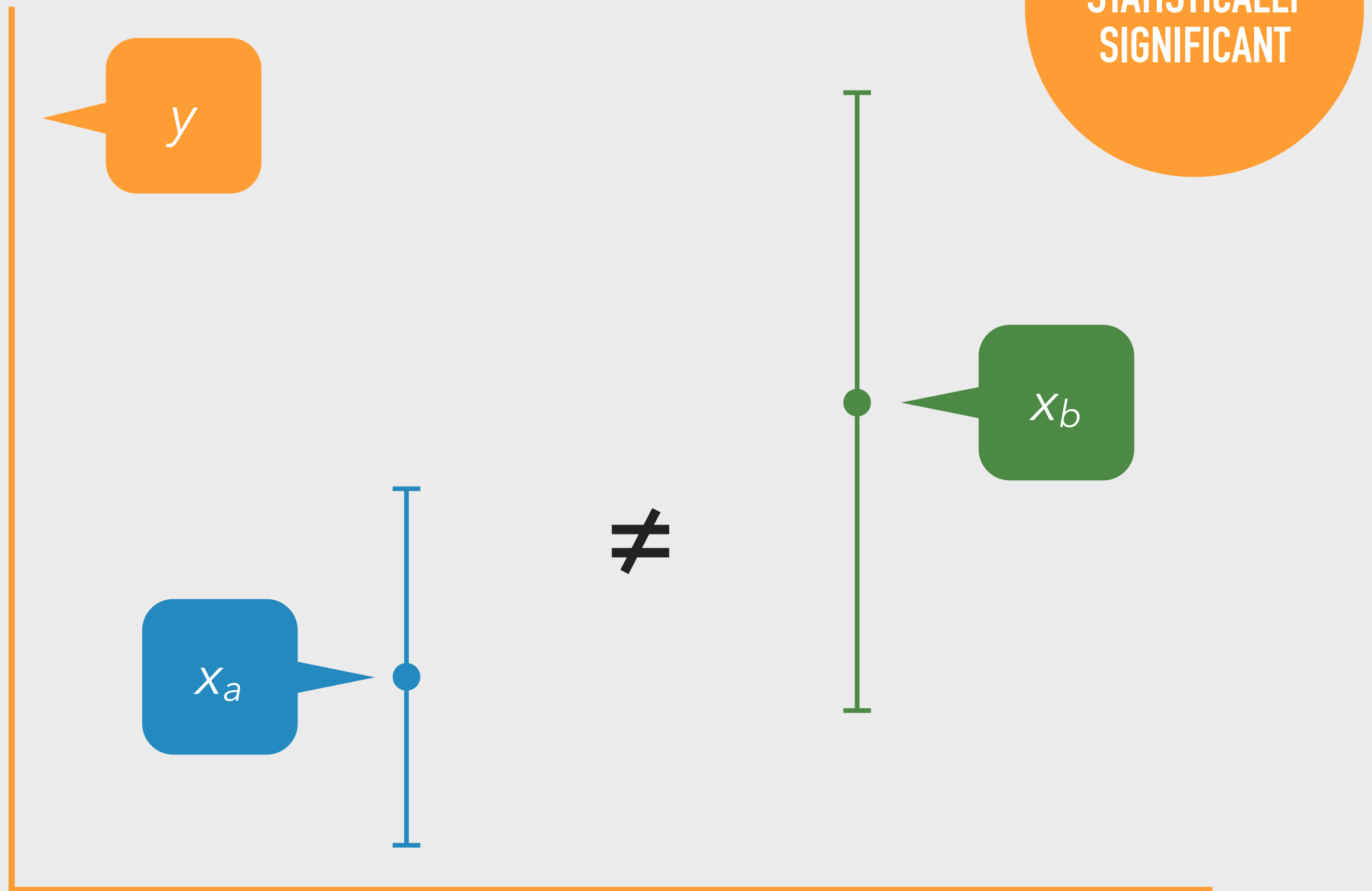
WELCH'S CORRECTED DEGREES OF FREEDOM

$$v \approx \frac{\left(\frac{s_a^2}{n_a} + \frac{s_b^2}{n_b} \right)^2}{\frac{s_a^4}{(n_a^2)(n_a - 1)} + \frac{s_b^4}{(n_b^2)(n_b - 1)}}$$

DIFFERENCE OF MEANS



DIFFERENCE OF MEANS

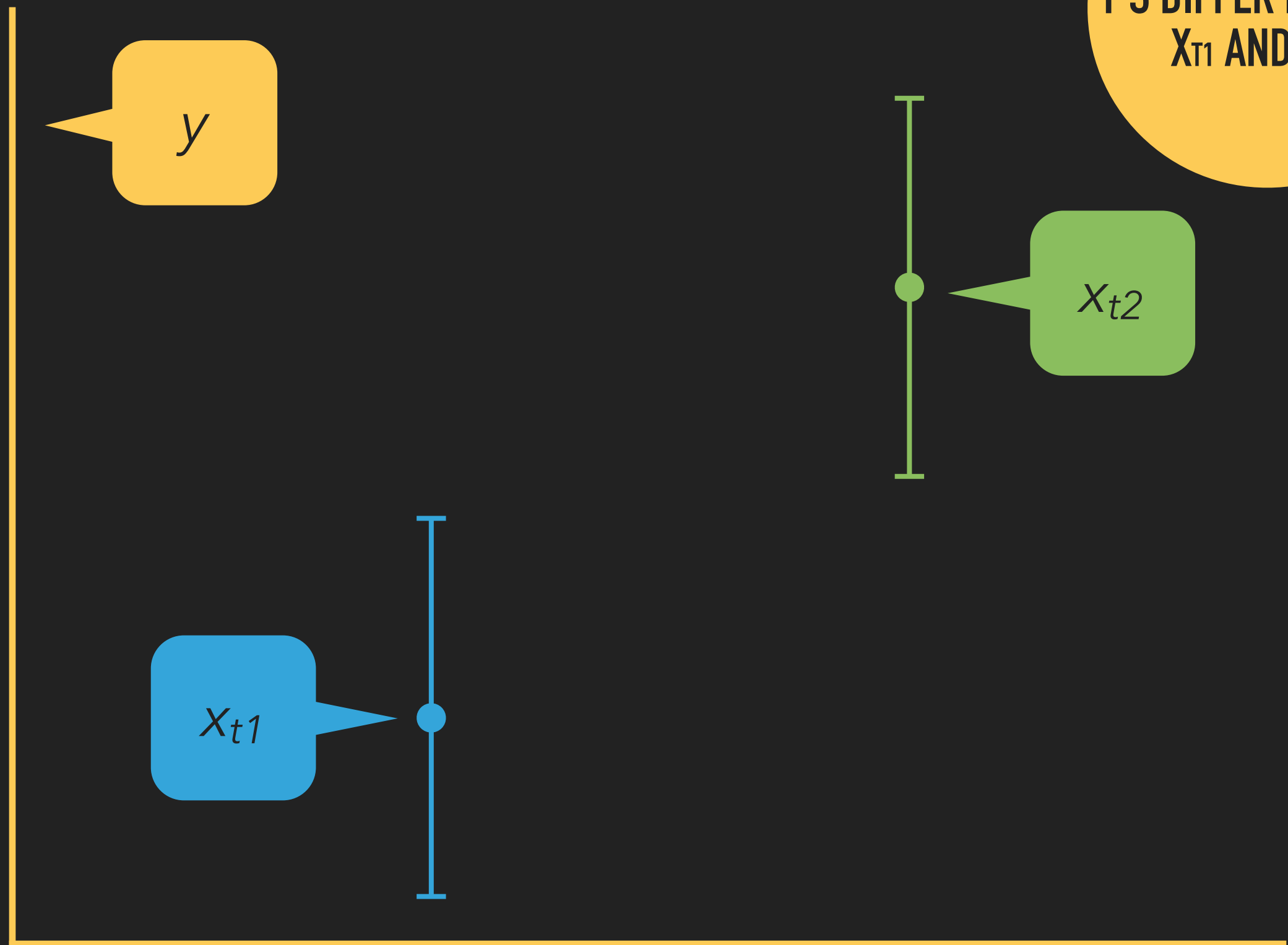


INTERPRETATION

- ▶ The independent t-test ($t=4.052, df=42, p<.001$) suggests that there is a significant difference in scores between men (mean of 20) and women (mean of 25). Results for women were found to be higher, on average, than results for men.

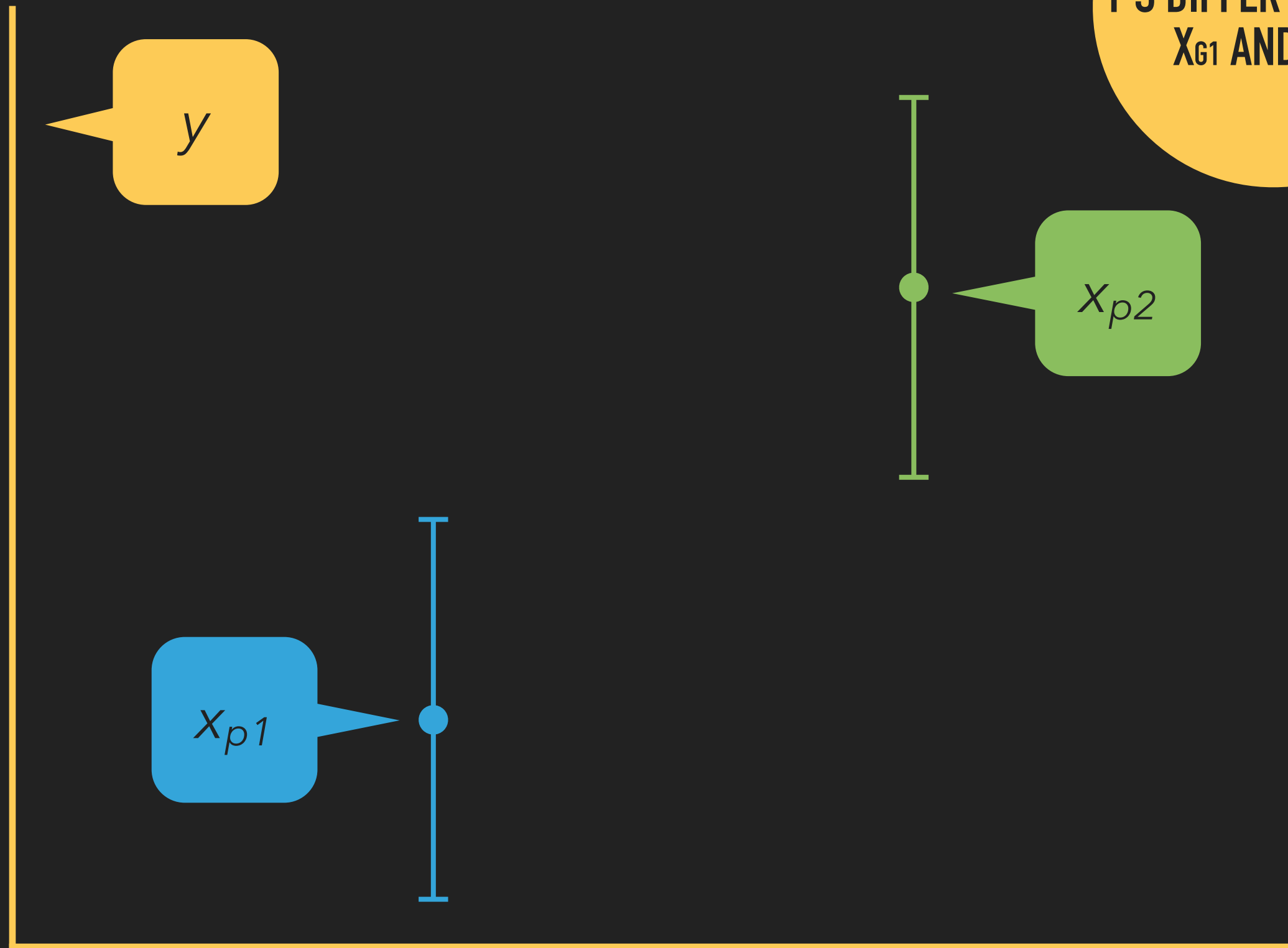
5 DEPENDENT SAMPLES

DIFFERENCE OF MEANS



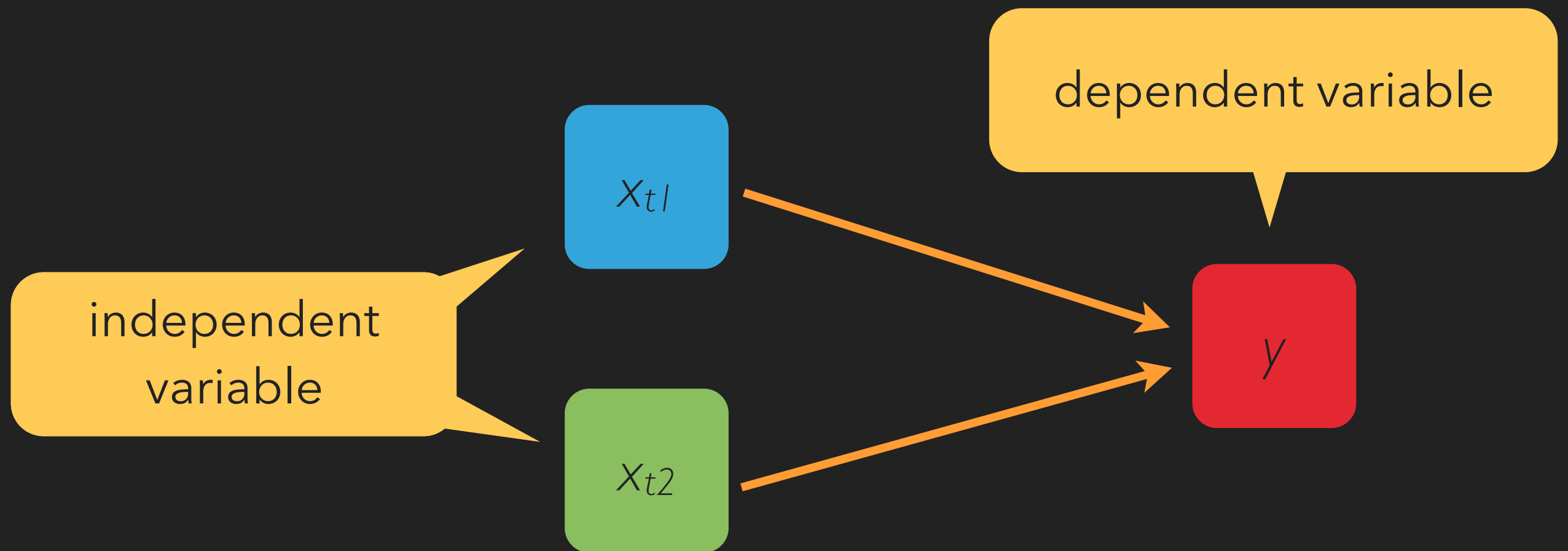
DO THE MEAN
Y'S DIFFER BETWEEN
 X_{T1} AND X_{T2} ?

DIFFERENCE OF MEANS

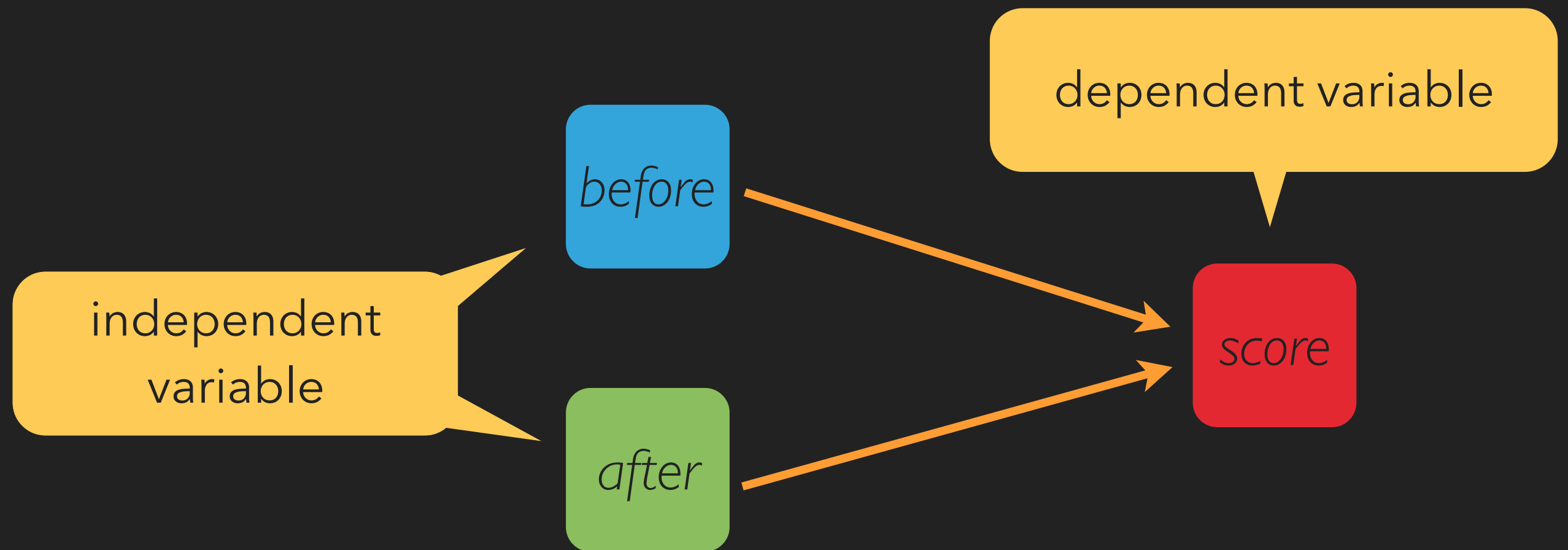


DO THE MEAN
Y'S DIFFER BETWEEN
 X_{G1} AND X_{G2} ?

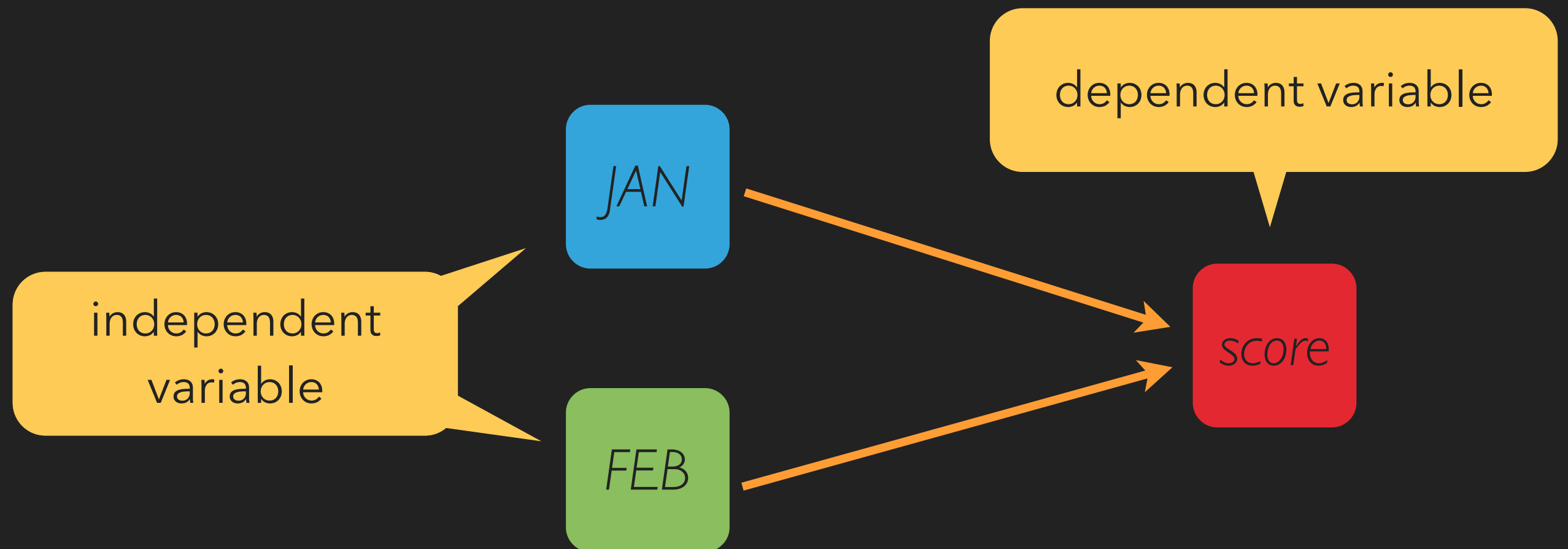
MODEL



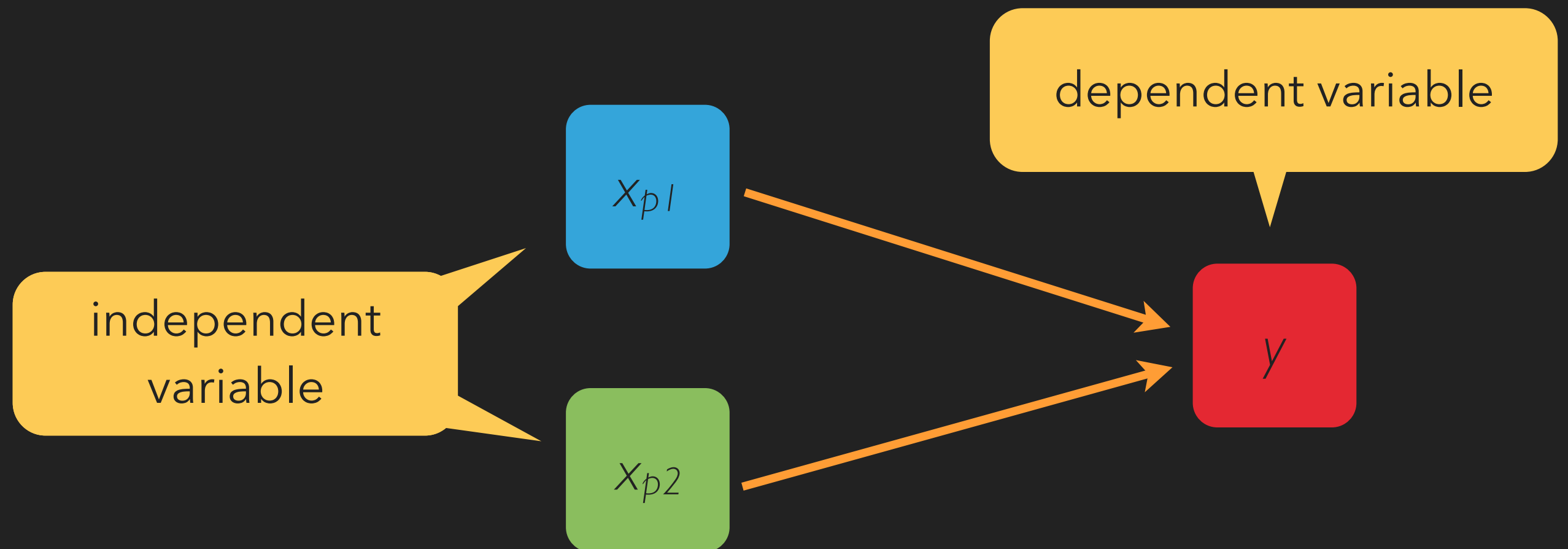
MODEL



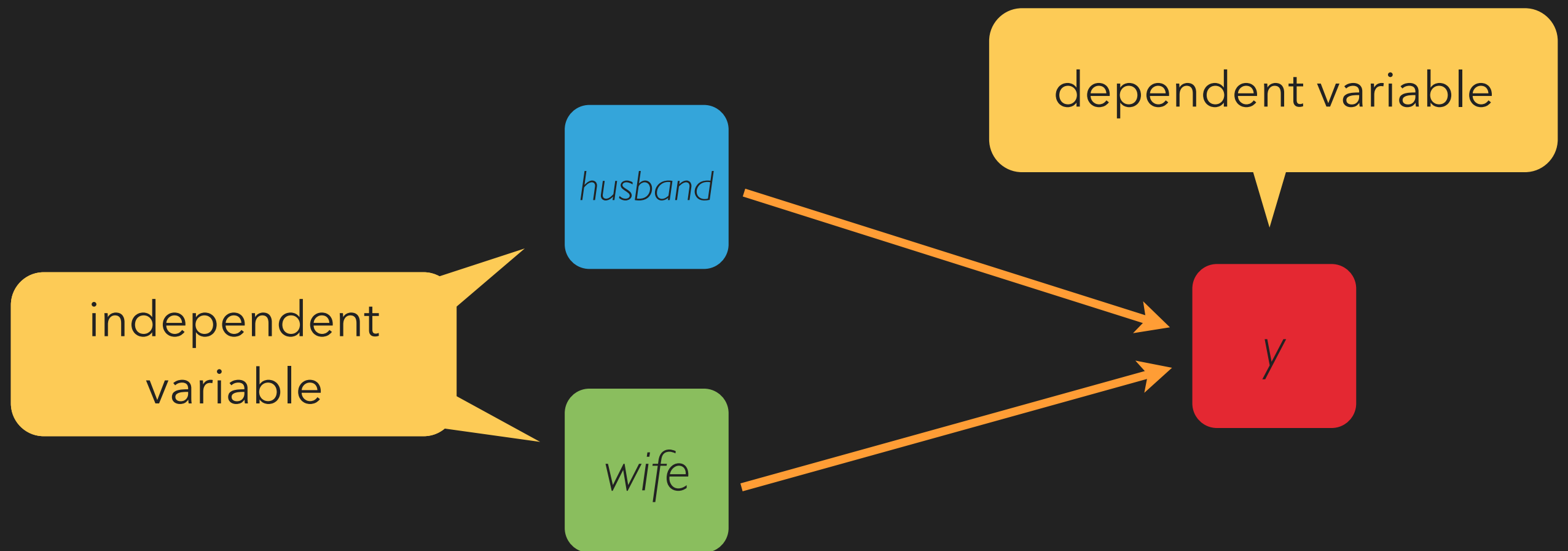
MODEL



MODEL



MODEL



HYPOTHESES

- ▶ H_0 = there is no difference in the mean of y between x_{t1} and x_{t2}
- ▶ H_1 = there is a difference in the mean of y between x_{t1} and x_{t2}

HYPOTHESES

- ▶ H_0 = there is no difference in the mean of y between x_{g1} and x_{g2}
- ▶ H_1 = there is a difference in the mean of y between x_{g1} and x_{g2}

ASSUMPTIONS

- ▶ dependent variable (y) is continuous
- ▶ independent variable is binary (x_{g1} and x_{g2})
- ▶ the distribution of the differences between x_{g1} and x_{g2} is normally distributed
- ▶ scores are dependent

EQUATION

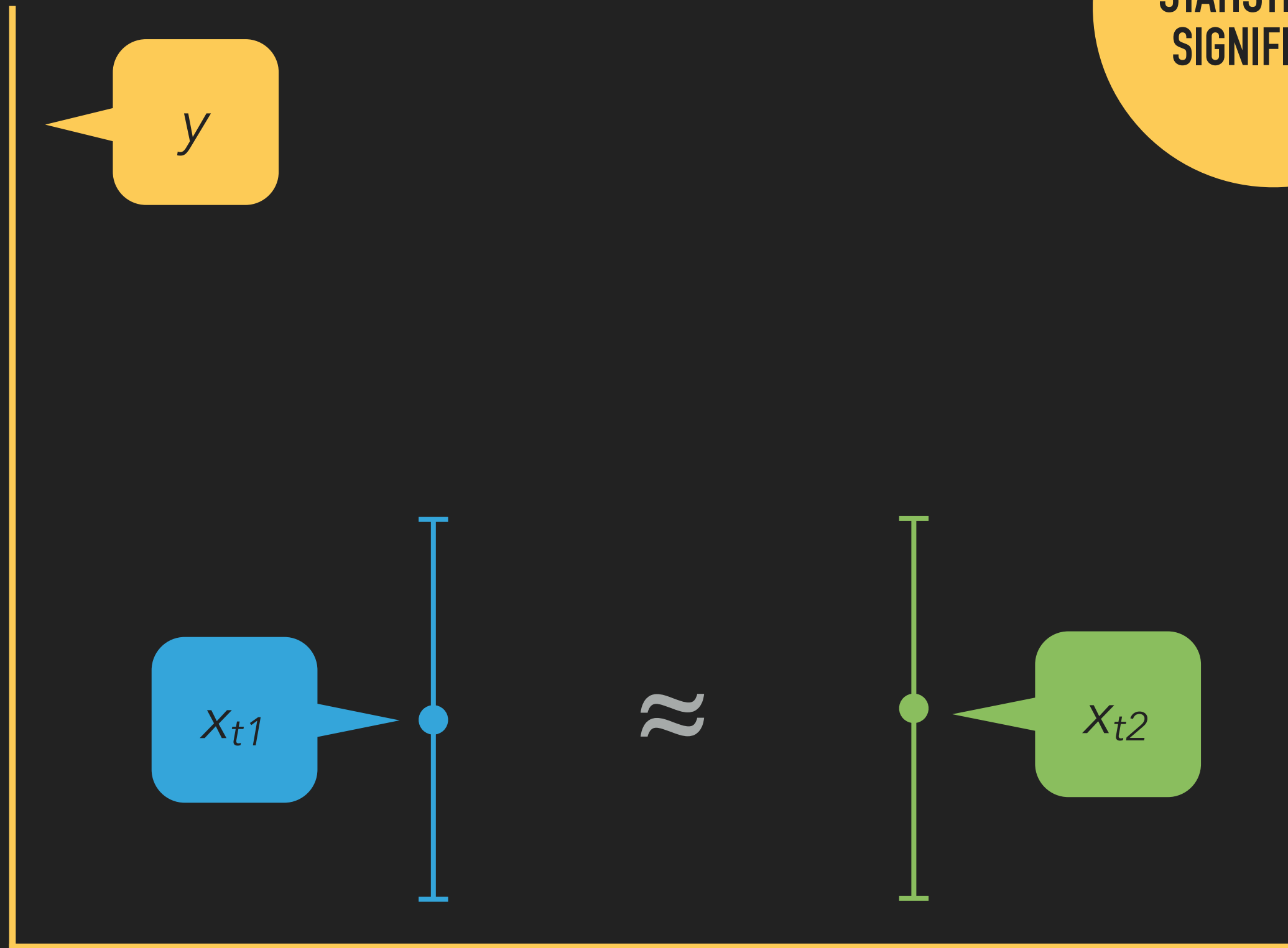
$$t = \frac{\bar{d}}{\sqrt{\frac{s_d^2}{n}}}$$

mean of difference
between groups

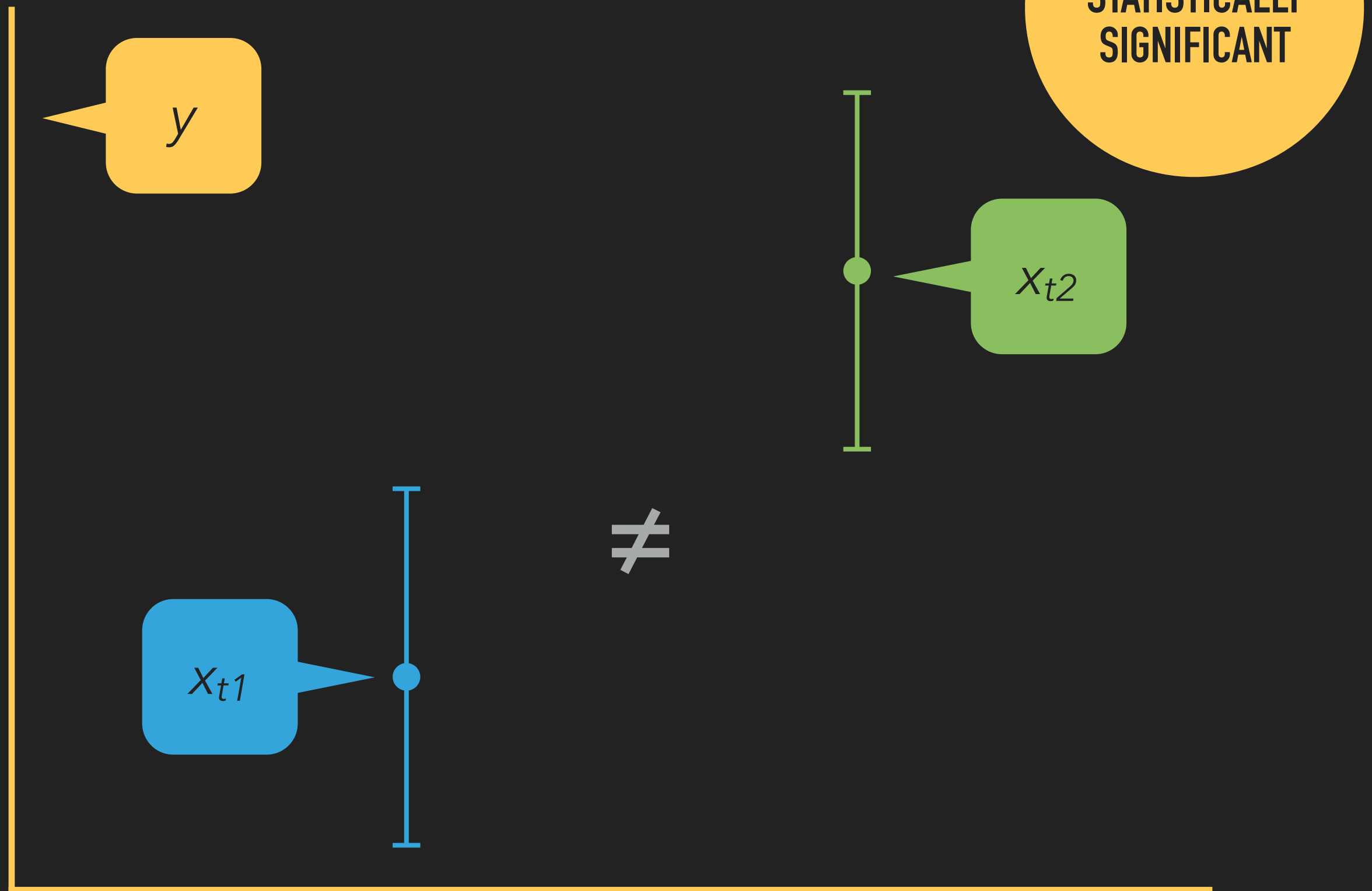
variance of difference
between groups

DIFFERENCE OF MEANS

T-TEST IS NOT
STATISTICALLY
SIGNIFICANT



DIFFERENCE OF MEANS



INTERPRETATION

- ▶ The dependent t-test ($t=4.052, df=42, p<.001$) suggests that there is a significant difference in scores between the pre-test (mean of 20) and the post-test (mean of 25). Post-test results were found to be higher, on average, than pre-test results.

LONG DATA

<i>participant</i>	<i>score</i>	<i>timePoint</i>
jane	10	before
jane	12	after
john	15	before
john	14	after

WIDE DATA

<i>participant</i>	<i>score1</i>	<i>score2</i>
jane	10	12
john	15	14
joe	12	12
jessica	8	11

RESHAPING DATA

<i>participant</i>	<i>score</i>	<i>timePoint</i>
jane	10	before
jane	12	after
john	15	before
john	14	after
joe	12	before
joe	12	after
jessica	8	before
jessica	11	after



<i>participant</i>	<i>score1</i>	<i>score2</i>
jane	10	12
john	15	14
joe	12	12
jessica	8	11

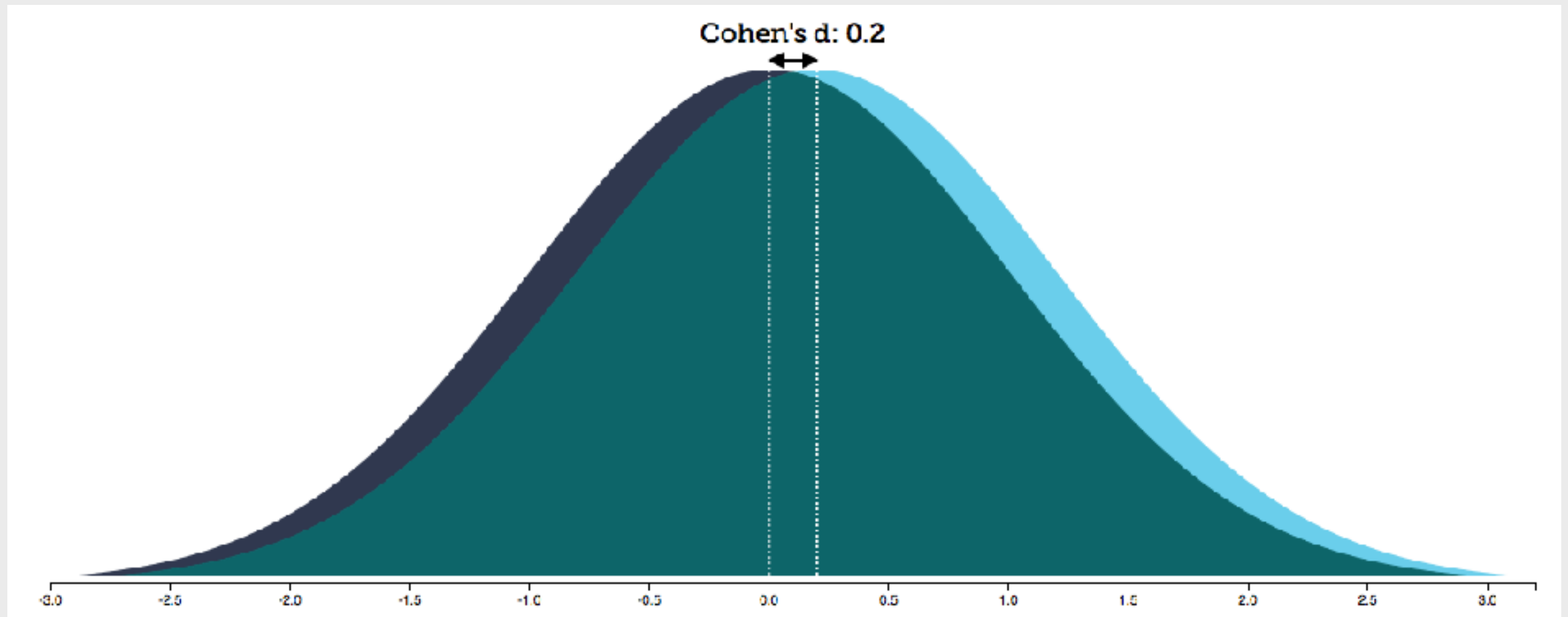
6 EFFECT SIZES

PROBLEM

Statistical Significance \neq Real World Significance

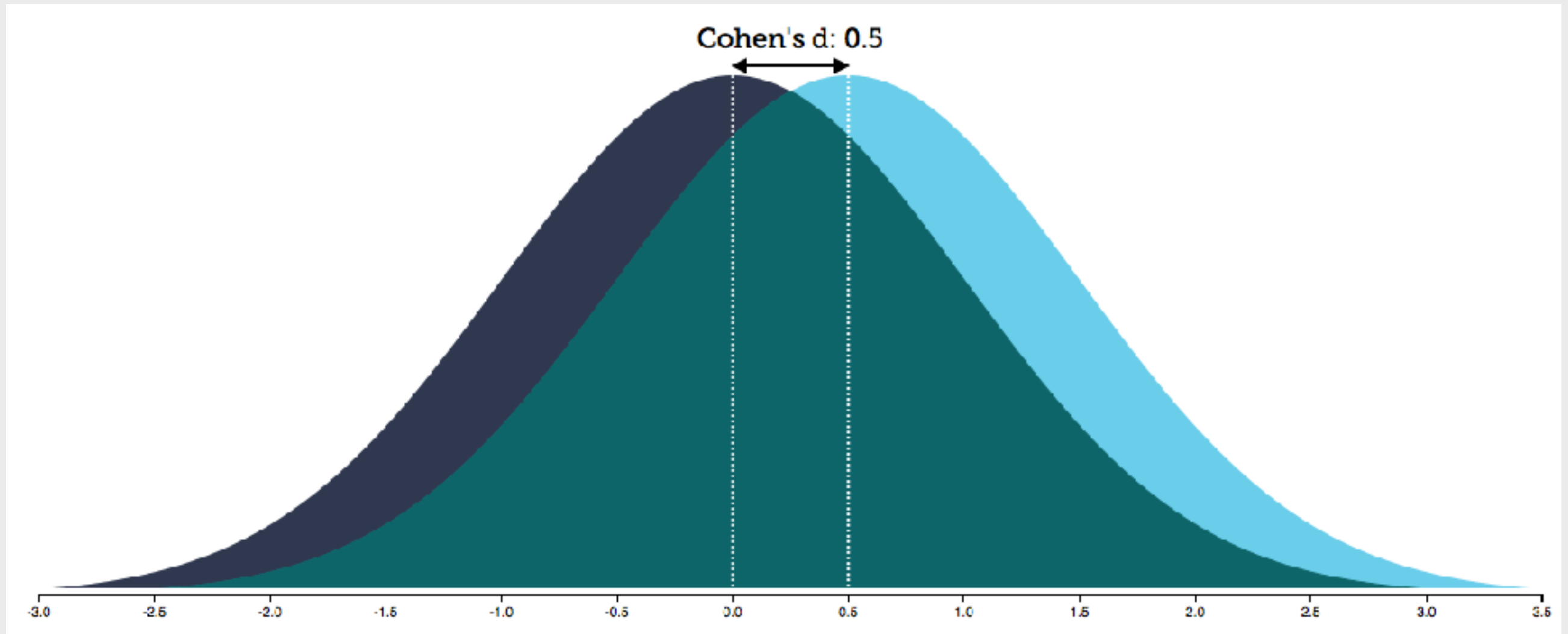
6. EFFECT SIZES

COHEN'S D INTERPRETATION



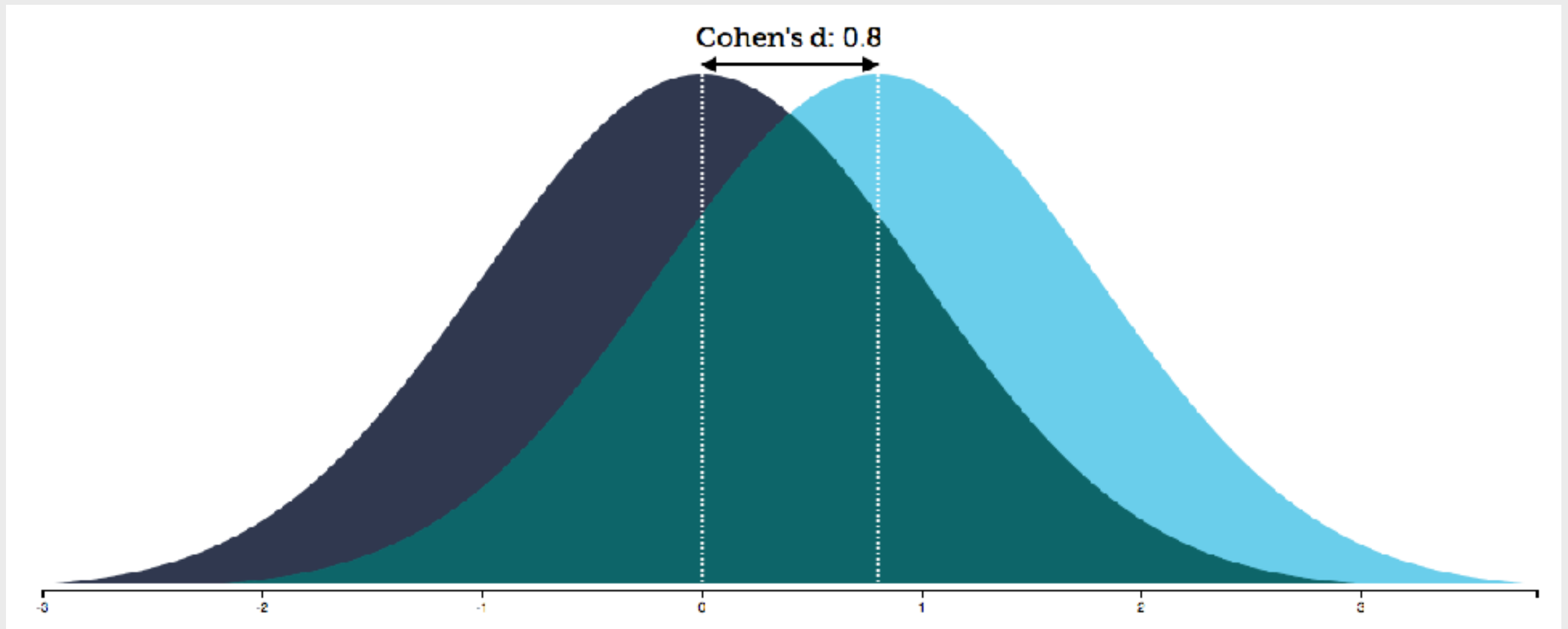
6. EFFECT SIZES

COHEN'S D INTERPRETATION



6. EFFECT SIZES

COHEN'S D INTERPRETATION



COHEN'S D EQUATION

$$d = \frac{\bar{x}_a - \bar{x}_b}{\sqrt{\frac{(n_a - 1)s_a^2 + (n_b - 1)s_b^2}{n_a + n_b - 2}}}$$

pooled variance

COHEN'S D EQUATION

$$d = \frac{M_t - M_c}{\sqrt{\frac{(n_t - 1)s_t^2 + (n_c - 1)s_c^2}{n_t + n_c - 2}}}$$

COHEN'S D EQUATION SIMPLIFIED

$$n_a = n_b$$

$$d = \frac{2t}{\sqrt{v}}$$

$$n_a \neq n_b$$

$$d = \frac{t (n_t + n_c)}{\sqrt{v} (\sqrt{n_t} + \sqrt{n_c})}$$

DOCUMENT DETAILS

Document produced by [Christopher Prener, Ph.D](#) for the Saint Louis University course SOC 5050: QUANTITATIVE ANALYSIS - APPLIED INFERENTIAL STATISTICS. See the [course wiki](#) and the repository [README.md](#) file for additional details.



This work is licensed under a [Creative Commons Attribution 4.0 International License](#).