Confidence Interval

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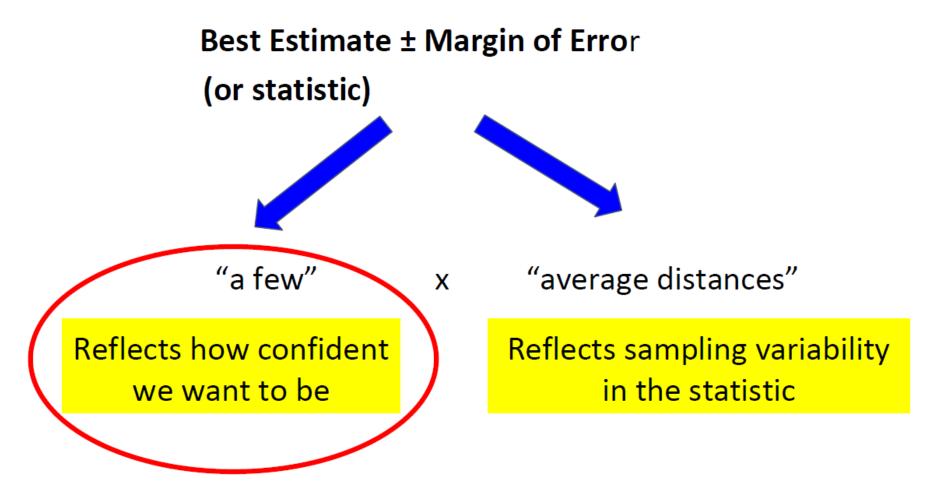
Principal idea of confidence interval

- From an estimate made by measuring a sample (eg. Sample mean) AND knowing the error in that value.
- State an interval in which the population value is likely to be

How to define "likely"? >> level of confidence Eg. 90%, 95%, ...

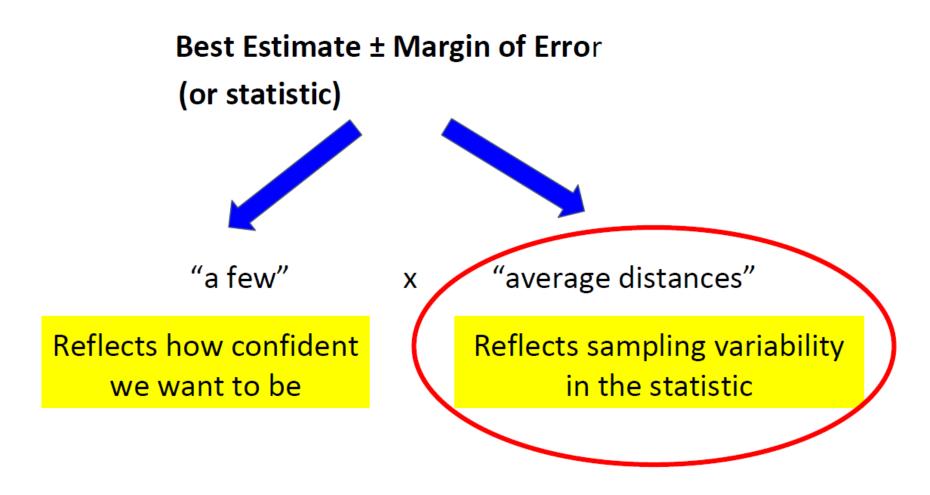


Confidence Interval Idea





Confidence Interval Idea





One Sample CI for μ

- Take the sample of size n from a Normal population with unknown mean μ and known standard deviation σ .
- A level C confidence interval for μ is:

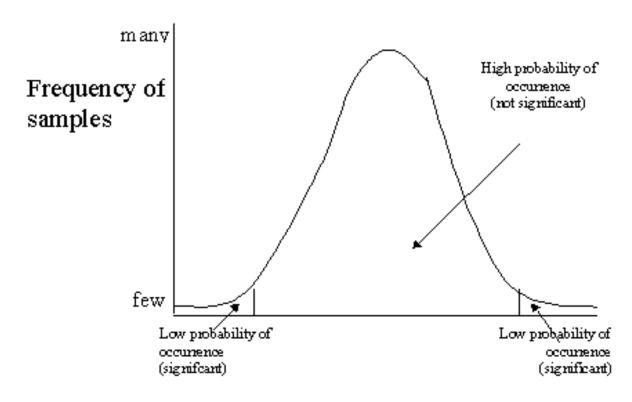
Sample mean ± margin of error

Sample mean \pm multiplier \times SD (\bar{x})

$$\overline{\mathbf{x}} \pm (\mathbf{z} \times \frac{\sigma}{\sqrt{n}})$$



Sampling Variability of the Estimate (Statistic)

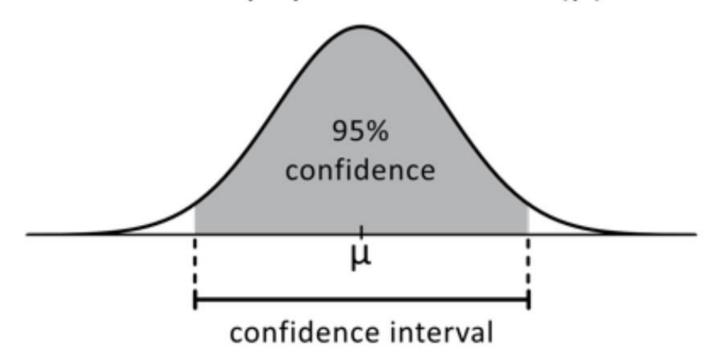


 Standard Deviation or Standard Error of the Statistic



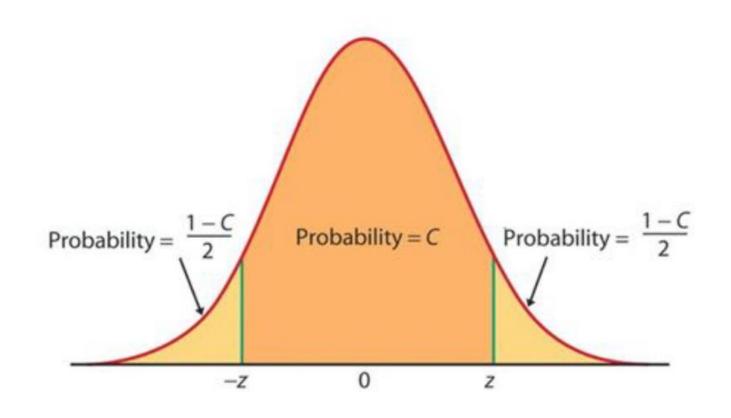
Confidence Interval Idea

Distribution of sample means (\bar{x}) around population mean (μ)





A Level C confidence interval



z = percentile value,1.645 (for 90% CI), 1.96 (for 95% CI), ... with scipy:

if 90% CI then from scipy.stats import norm z=norm.ppf(0.95)

if 95% CI then z=norm.ppf(0.975)



Interpreting the level of confidence

The level of confidence is ...

• In the long run, the % of all confidence intervals computed in this way will capture the population value.

Eg. 95% CI means in the long run, 95% of all confidence intervals computed in this way will capture the population value.



Sample Poll

What proportion of parents report they use a car seat for all travel with their toddler?

Population – parents with a toddler

Parameter of Interest – A proportion

Construct a 95% Confidence Interval for the population proportion of parents reporting they use car seat for all travel with their toddler



Sample Poll

A sample of 659 parents with toddler was taken and asked if they used car seat for all travel with their toddler.

540 parents responded 'YES' to this question.



95% Confidence Interval Calculations

Best Estimate ± Margin of Error

 $\widehat{p} \pm Margin of Error$

$$\hat{p} = x/n = 540/659 = 0.85$$



95% Confidence Interval Calculations

Best Estimate ± Margin of Error

 $\widehat{p} \pm \mathsf{Margin}$ of Error

 \widehat{p} ± "a few". estimated se (\widehat{p})

$$\widehat{p} \pm 1.96 \cdot \sqrt{\frac{\widehat{p}(1-\widehat{p})}{n}}$$

$$0.85 \pm 1.96 \cdot \sqrt{\frac{0.85(1-0.85)}{659}}$$

 0.85 ± 0.0273

(0.8227, 0.8773)



Confidence Interval for parameter

We make a confidence interval for a parameter

parameter or statistic



"range of reasonable values for our parameter"

We estimate, with 95% confidence, the population proportion of parents with toddler who report they use a car seat for all travel with their toddler is somewhere between 82.27% - 87.73%

or

Based on our sample of 659 parents with toodlers, with 95% confidence, we estimate between 82.3% and 87.7% of all such parents report they use car seat for all travel with their toodler



"range of reasonable values for our parameter"

We estimate, with 95% confidence, the population proportion of parents with toddler who report they use a car seat for all travel with their toddler is somewhere between 82.27% - 87.73%

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Based on our sample of 659 parents with toodlers, with 95% confidence, we estimate between 82.3% and 87.7% of all such parents report they use car seat for all travel with their toodler



Car Seats for toddlers example

Does our confidence interval of (0.8227 - 0.8773) contain *sample proportion* of parents with toddlers who report they use car seat for all travel with toddler

'YES' it most certainly does.. our interval is centered at that sample proportion of 0.85 or 85%



Car Seats for toddlers example

Does our confidence interval of (0.8227 - 0.8773) contain *population proportion* of parents with toddlers who report they use car seat for all travel with toddler

Based on the limited data that we got, WE DON'T KNOW



Wrong understanding of Confidence Level

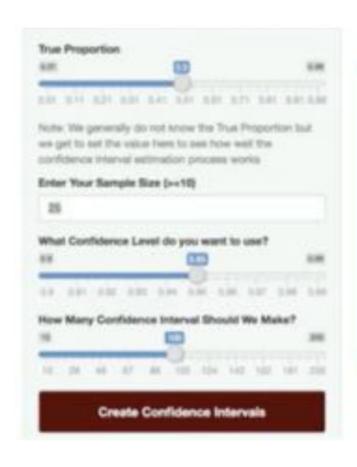
95% chance or probability that the population proportion is in this computed interval of (0.8227, 0.8773)



Correct understanding of Confidence Level

95% confidence level refers to our confidence in the statistical procedures that was used to compute this interval



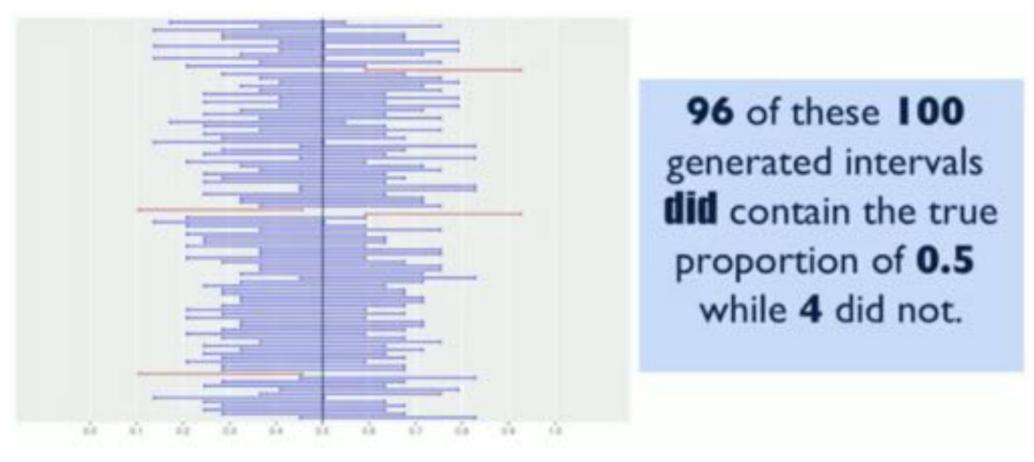


Population Proportion = 0.50

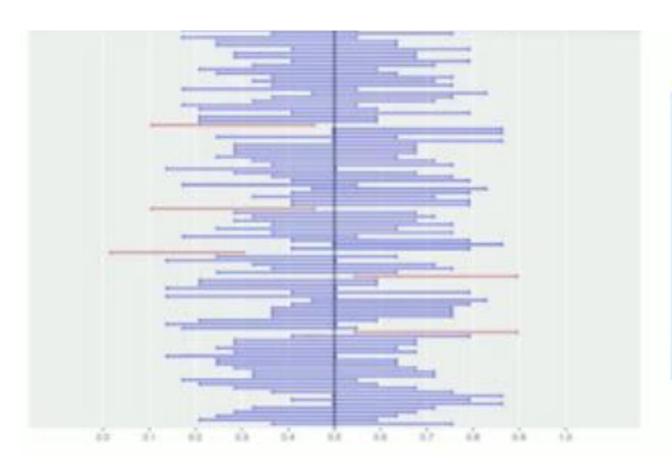
Take 100 samples each of size 25

For each sample, create a 95% confidence interval for the population proportion



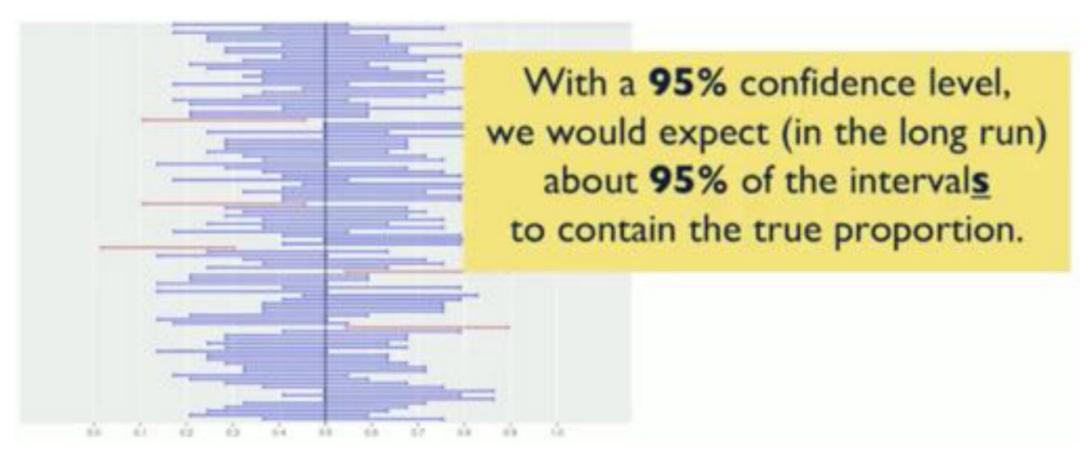






95 of these 100 generated intervals did contain the true proportion of 0.5 while 5 did not.







Different Z Multipliers

90%	95%	98%	99%
1.645	1.96	2.326	2.576

Best Estimate ± Margin of Error

Best Estimate ± "a few" (estimated) standard errors

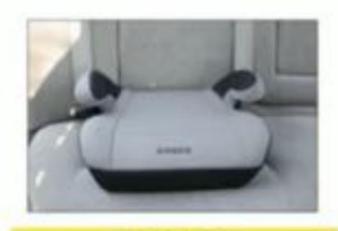
(656)

More confident → Larger Multiplier → Wider Interval



Sample Poll Example

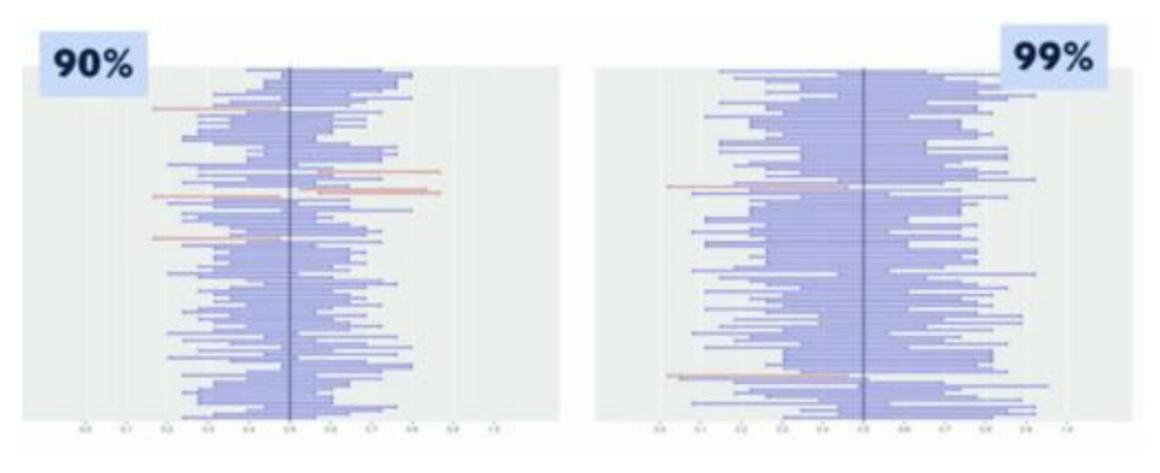
In a sample of 659 parents with a toddler, 540 (or 85%) stated they use a car seat for all travel with their toddler.



90% CI: 0.85 ± 0.0229 82.7% to 87.3% 95% CI: 0.85 ± 0.0273 82.3% to 87.7% 99% CI: 0.85 ± 0.0358 81.4% to 88.6%



Changing Confidence Level





In short...

- Confidence Intervals are used to give an *interval* estimate for our parameter of interest.
- Center of Confidence of Interval = our best estimate
- Margin of Error (MoE) = "a few" estimated standard of errors



Demo

Confidence Interval Estimation



Demo Site

- Seeing Theory A Visual Introduction to Probability and Statistics
- https://seeing-theory.brown.edu/frequentistinference/index.html



Stream health is measured in part from the dissolved oxygen content (DOC). A water authority collected a litre of water from each of 45 locations along a stream measured the DOC in each specimen. The mean content was found to be 4.62 mg/L.

Dissolved oxygen is known in this area (from long-term data) to be distributed Normally with σ = 0.92 mg/L.

- a) Construct a 95% confidence interval for the average DOC in this particular stream at this time.
- b) Is this strong evidence that the stream has a mean DOC less than 5 mg/L?



$$\bar{x}$$
 = 4.62, σ = 0.92, n = 45

a) Construct a 95% confidence interval for the average DOC in this particular stream at this time.

95% CI for μ:

$$\overline{\mathbf{x}} \pm (\mathbf{z}^* \times \frac{\sigma}{\sqrt{\mathbf{n}}}) = 4.62 \pm (1.96 \times \frac{0.92}{\sqrt{45}}) = (4.35, 4.89)$$

Or using scipy: import numpy as np

(4.62 + np.array([+1, -1])*norm.ppf(0.975)*(0.92)/np.sqrt(45))

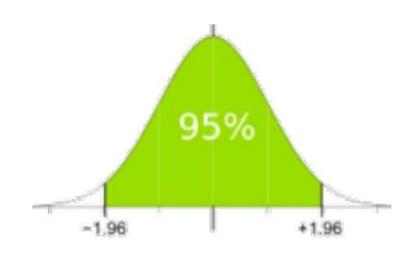
b) Is this strong evidence that the stream has a mean DOC less than 5 mg/L?
Yes, since the value of the CI is below 5mg/L



Della wants to make a one-sample z interval to estimate what proportion of her community members favor a tax increase for more local school funding. She wants her margin of error to be no more than ±2% at the 95% confidence interval.

What is the smallest sample size required to obtain the desired margin of error?





$\widehat{p} \pm \mathsf{Margin}$ of Error

$$\hat{p} \pm z^* \cdot \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$

$$\hat{p} \pm 1.96 \cdot \sqrt{\frac{\hat{p}(1-\hat{p})}{n}} \le 2\%$$

$$1.96. \sqrt{\frac{0.5.0.5}{n}} \le 2$$

$$n \ge 49^2$$

$n \ge 2401$

Minimum sample size is 2401

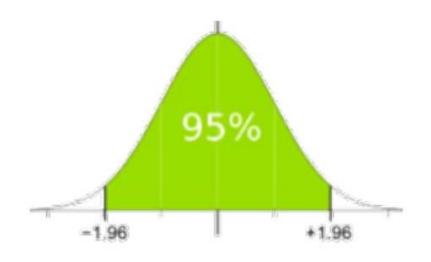


A sample of 659 parents with toddler was taken and asked if they used car seat for all travel with their toddler. 540 parents responded 'YES' to this question.

With confidence interval of 95%, calculate the Margin of Error.



Example 3



$\widehat{p} \pm \mathsf{Margin}$ of Error

$$\hat{p} \pm z^* \cdot \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$$
 $\hat{p} \pm 1.96 \cdot \sqrt{\frac{\hat{p}(1-\hat{p})}{n}}$

$$\pm 1.96.\sqrt{\frac{0.819(1-0.819)}{659}}$$

± 2.94

Margin of Error is 2.94

Forward School

Two Proportions



Research Question

What is the difference in population proportions of parents reporting that their children age 6-18 have had some swimming lessons between white and black children?



Populations - All parents of white children age 6-18 and all parents of black children age 6-18

Parameter of Interest - Different in Population Proportions (p₁-p₂)

We will let 1 = White and 2 = Black



Survey Results

- A sample of 247 parents of black children age 6-18 was taken with 91 saying that their child has had some swimming lessons
- A sample of 988 parents of white children age 6-18 was taken with 543 saying that their child has had some swimming lessons



Difference in Proportion Confidence Interval

Best Estimate ± Margin of Error

$$\hat{p}_1 - \hat{p}_2 \pm \text{Margin of Error}$$

$$\hat{p}_1 - \hat{p}_2 \pm$$
"a few".se($\hat{p}_1 - \hat{p}_2$)

$$\hat{p}_1 - \hat{p}_2 \pm 1.96. \sqrt{\frac{\hat{p}_1(1-\hat{p}_1)}{n_1} + \frac{\hat{p}_2(1-\hat{p}_2)}{n_2}}$$



Best Estimate of the Parameter

$$\hat{p}_1 = \frac{543}{988} = 0.55$$

$$\hat{p}_2 = \frac{91}{247} = 0.37$$

$$\hat{p}_1 - \hat{p}_2 = 0.55 - 0.37 = 0.18$$

1 = White and 2 = Black

$$\hat{p}_1 - \hat{p}_2 \pm 1.96. \sqrt{\frac{\hat{p}_1(1-\hat{p}_1)}{n_1} + \frac{\hat{p}_2(1-\hat{p}_2)}{n_2}}$$

$$0.18 \pm 1.96 \cdot 0.0345$$

$$0.18 \pm 0.0677$$



Interpreting Confidence Interval

"range of reasonable vavlues for our parameter"

With 95% confidence, the population proportion of parents with white children who have taken swimming lessons is 11.23% to 24.77% higher than the population proportions of parents with black children who have taken swimming lessons.



Intervals for Differences

Is there a difference between 2 parameters?

If parameters are equal \rightarrow difference is 0

If parameters are unequal \rightarrow difference is not 0

Look for 0 in the range of reasonable values



Assumptions

- We need to assume that we have two independent random samples
- We also need large enough sample sizes to assume that the distribution of our estimate is normal. That we need

$$n_1\hat{p}_1, n_1(1-\hat{p}_1), n_2\hat{p}_2$$
 and $n_2(1-\hat{p}_2)$ to be at least 10.

In other words, we need at least 10 YES's and 10 NO's for each sample



One Sample CI for μ

If σ is unknown, then we use s to estimate σ and student t distribution is used instead of normal distribution

A level C confidence interval for μ is:

$$\overline{\mathbf{x}} \pm (\mathbf{t}_{df} \times \frac{\mathbf{s}}{\sqrt{n}})$$

df: degree of freedom

df = n–1, for the cases of one sample or match pair (termed as paired interval: e.g., before and after, follow-up and baseline)

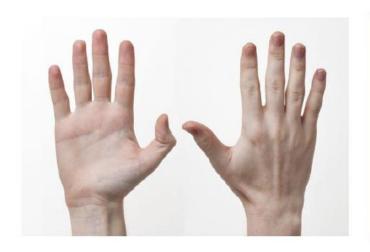


Estimating a Mean Difference for Paired Data



Paired Values

- Want to treat the two set of values simultaneously
- Other ways paired data arises:
 - Measurement collected on same individual









Paired Values

- Want to treat the two set of values simultaneously
- Other ways paired data arises:
 - Measurement collected on same individual
 - Measurement collected on matched individual









Paired Values

- Want to treat the two set of values simultaneously
- Other ways paired data arises:
 - Measurement collected on same individual
 - Measurement collected on matched individual
- Variable: Difference of measurements within pairs



Research Question

What is the <u>average</u> difference between the older twin's and younger twin's self reported education?

Construct a 95% confidence interval for the mean difference of reported education for a set of identical twins

Population - All identical twins

Parameter of Interest - Population mean difference of self reported education level μ_d

Difference: Older - Younger





Difference Calculation

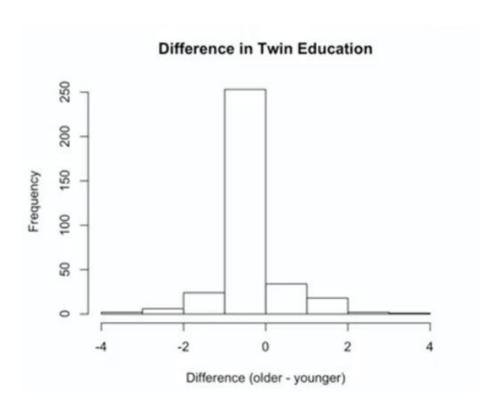
Difference = older twin - younger twin

Older twin education	Younger twin education	Difference (older - younger)	
16	16	0	
18	16	2	
12	12	0	
14	14	0	
13	15	-2	



Difference Summary

Difference = older twin - younger twin



n = 340 observations

minimum = - 3.5 years maximum = 4 years 72.1% had a difference of 0 years

mean = 0.0838 years Standard Deviation = 0.7627 years



95% Confidence Interval Calculations

Best Estimate ± Margin of Error

Sample mean difference ± "a few" · estimated standard error

$$\bar{x}_d \pm t^* \left(\frac{s_d}{\sqrt{n}}\right)$$

 t^* multiplier comes from a t-distribution with n-1 degrees of freedom

95% confidence

$$n = 25 \rightarrow t^* = 2.064$$

 $n = 1000 \rightarrow t^* = 1.962$



Mean Difference Confidence Interval

mean = 0.0838 years Standard Deviation = 0.7627 years

n = 340 observations
$$\rightarrow t^*=1.967$$

$$\bar{x}_d \pm t^* \cdot (\frac{s_d}{\sqrt{n}})$$

$$0.084 \pm 1.967. (\frac{0.76}{\sqrt{340}})$$

$$0.084 \pm 1.967.(0.04)$$

$$0.084 \pm 0.814$$

(0.0025, 0.1652) years



Intrepreting Confidence Interval

"range of reasonable values for our parameters"

With 95% confidence, the population mean difference of the older twin's less than younger twin's self reported education is estimated to be between 0.0025 years and 0.6152 years.

Is there a difference between education levels of the older and younger twins?



Interval for differences

- Is there a mean difference between the education levels of twins?
- If education levels are generally equal → mean difference is 0
- If education levels are unequal → mean difference is not 0
- Hence, look for 0 in the range of reasonable values



Assumptions

- We need to assume that we have a random sample of identical twins
- Population of difference is normal (for a large sample size can help to bypass this assumption)



Estimating a Difference in Population Means with Confidence (for Independent Groups)



Research Question

Considering Mexican-American Adults (age 18-29) living in the United States, do males and females differ significantly in mean Body Mass Index (BMI)?

Population - Mexican-American Adults (age 18-29) living in the United States

Parameter of Interest (\mu_1-\mu_2) - Body Mass Index or BMI (kg/m²)



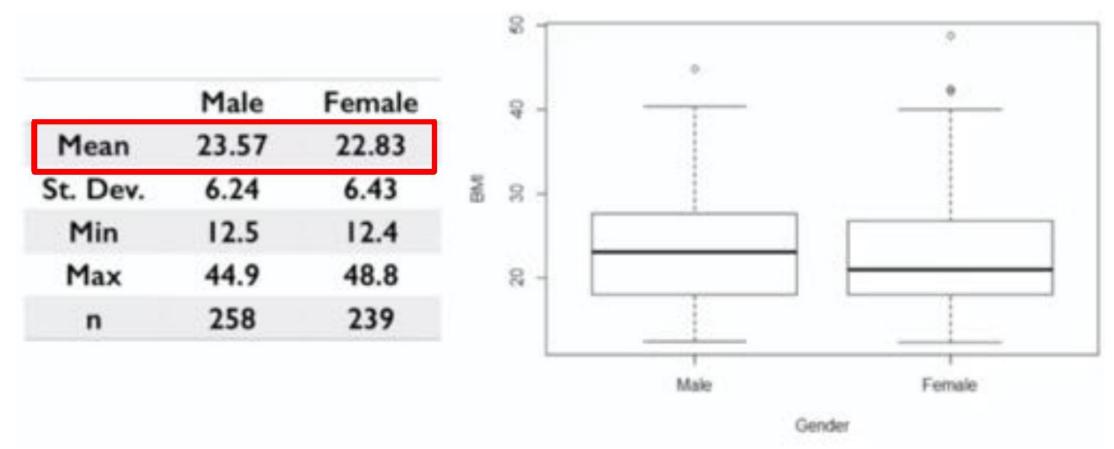
NHANES Data

Gender	BMI	Race	Age 18-29
1	19.9	1	1
2	17.0	1	1
2	26.7	1	1
1	25.6	1	1

The data was filtered to include only Mexican-American adults that were between the ages of 18 and 29.



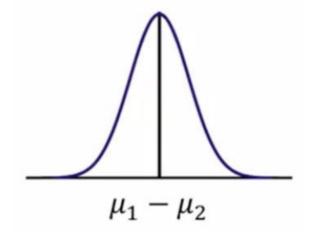
BMI Variable Summary





Sampling Distribution of the Difference in Two (Independent) Sample Means

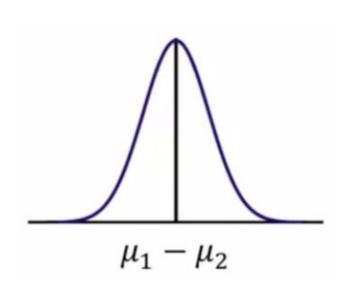
If models for both populations of responses are approximately normal (or sample sizes are both 'large' enough), distribution of the difference in sample means is (approximately) normal.



All possible values of <u>difference in sample means</u>



Sampling Distribution of the Difference in Two (Independent) Sample Means



Standard Error =
$$\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

Estimated Standard Error = $\sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$

All possible values of <u>difference in sample means</u>



Confidence Interval Basics

Best Estimate ± Margin of Error

Best Estimate = Unbiased Point Estimate

Margin of Error = "a few" estimated Standard Errors

" a few" = multiplier from appropriate distribution based on desired confidence level and sample design

95% confidence level \longleftrightarrow 0.05 significance



Confidence Intervals Approaches

Pooled Approach

The variance of the two populations are assumed to be equal $(\sigma_1^2 - \sigma_2^2)$

Unpooled Approach

The assumption of equal variances is dropped



Unpooled Confidence Intervals Calculations

Best Estimate ± Margin of Error

Difference in sample means ± "a few" . estimated standard errors

$$(\bar{x}_1 - \bar{x}_2) \pm t^* \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}$$

The degree of freedom (df) for t* is the approximated values of taking the smaller of n_1 -1 and n_2 -1 (i.e df = min(n_1 -1, n_2 -1))



Unpooled Confidence Intervals Calculations

Best Estimate ± Margin of Error

Difference in sample means ± "a few". estimated standard errors

$$(\bar{x}_1 - \bar{x}_2) \pm 2 - \sqrt{\frac{(n_1 - 1)s_{1+}^2(n_2 - 1)s_2^2}{n_1 + n_2 - 2}} \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}$$

$$(\bar{x}_1 - \bar{x}_2) \pm t^* \sqrt{\frac{(n_1 - 1)s_{1+}^2(n_2 - 1)s_2^2}{n_1 + n_2 - 2}} \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}$$

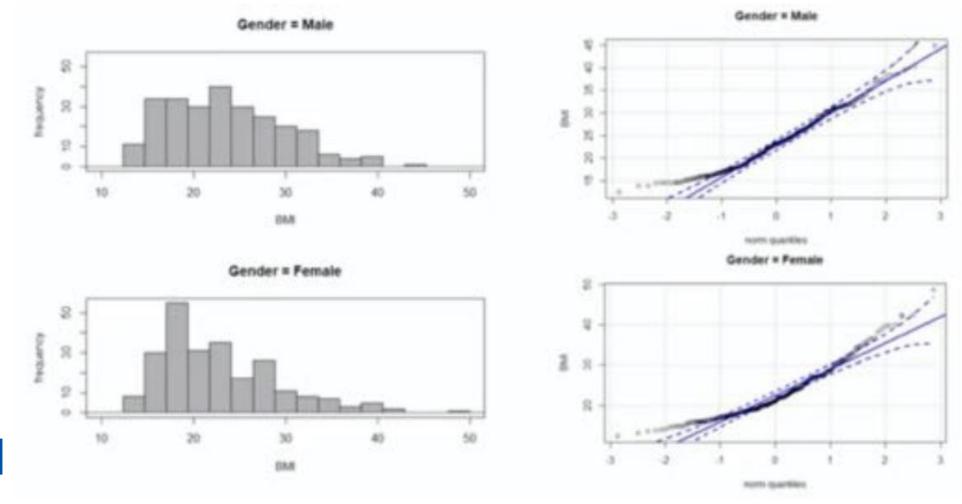
 t^* multiplier comes from a t-distribution with $n_1 + n_2 - 2$ degrees of freedom. With the assumption of population variances are equal.



Considering Mexican-American adults (ages 18-29) living in the United States, do males and females differ significantly in Body Mass Index (BMI)?

Normality Assumption: models for both populations of responses are approximately normal (or sample sizes are both 'large' enough)







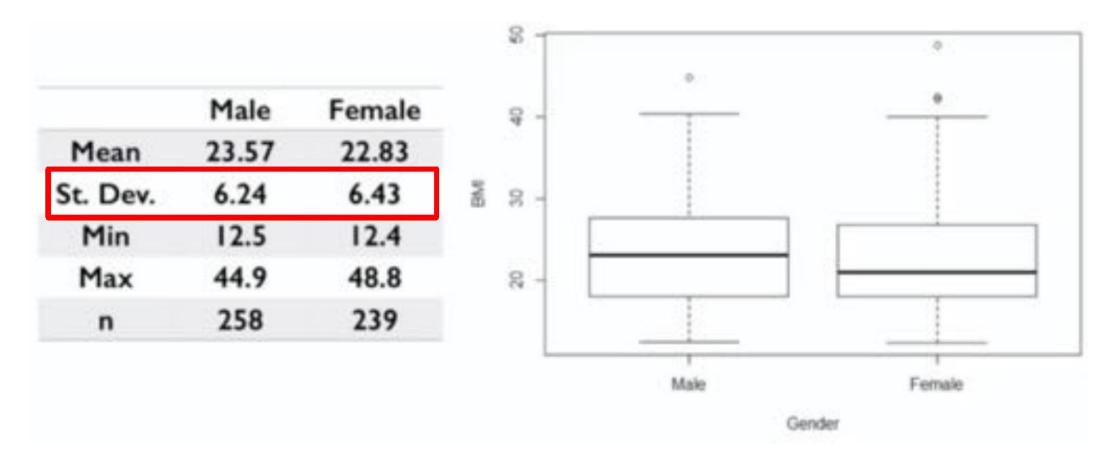
Considering Mexican-American adults (ages 18-29) living in the United States, do males and females differ significantly in Body Mass Index (BMI)?

Normality Assumption: models for both populations of responses are approximately normal (or sample sizes are both 'large' enough)

Both distributions have a slight-to-moderate right skew, but with large sample sizes, let us apply Central Limit Theorem (CLT) and continue

Variance Assumption: Enough evidence to assume equal variances between two populations - hence use "pooled" approach







95% Confidence Interval Example

	Male	Female
Mean	23.57	22.83
St. Dev.	6.24	6.43
Min	12.5	12.4
Max	44.9	48.8
n	258	239

$$(\bar{x}_1 - \bar{x}_2) \pm t^* \sqrt{\frac{(n_1 - 1)s_{1+}^2(n_2 - 1)s_2^2}{n_1 + n_2 - 2}} \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}$$

Here, t* multiplier of 1.98 will be used



95% Confidence Interval Example

	Male	Female
Mean	23.57	22.83
St. Dev.	6.24	6.43
Min	12.5	12.4
Max	44.9	48.8
n	258	239

$$(23.57 - 22.83) \pm 1.98 \sqrt{\frac{(258-1)6.24^2(239-1)6.43^2}{258+239-2}} \sqrt{\frac{1}{258} + \frac{1}{239}}$$

$$0.74 \pm 1.98 (6.33) (0.0898)$$

$$(-0.385, 1.865)kg/m^2$$



Interpreting Confidence Interval

 $(-0.385, 1.865)kg/m^2$

"range of reasonable values for our parameter"

With 95% confidence, the difference in mean Body Mass Index (BMI) between males and females for all Mexican-American adults (ages 18-29) in the US is <u>estimated</u> to be between -0.385 kg/m² and 1.865 kg/m².



Interpreting Confidence Interval

What does "with 95% confidence" mean?

If this procedure were repeated over and over, each time producing a 95% confidence interval estimate,

we would expect 95% of those resulting intervals, to contain the difference in population mean in BMI.



Summary

- Confidence Intervals are used to give an interval estimate for our parameter of interest - difference in population means
- Center of the Confidence Interval is our best estimate ~ difference in sample means
- Margin of Errors is "a few" (estimated) standard errors ~ for two
 means we use t* multipliers (pooled vs unpooled)
- Assumptions for Cl's for Difference in Population Means
 - Data are two simple random samples, independent
 - both populations of responses are normal (else large n helps)
- Know how to interpret the interval and level



The student t Distribution

- The t density curve is similar in shape to the standard
- Normal curve: symmetric about 0 and bell-shaped
- The spread of the t distributions is a bit greater than that of the standard Normal curve (i.e., the t curve is slightly "fatter" at the tail)
- As n increases, s is a more accurate estimation of σ. So t distribution changes in width with sample size as reflected in the degrees of freedom
- When n is large s ≈ σ and the t-distribution approach normal distribution:

Forward School

A Cola maker wants to test a new recipes for loss of sweetness during storage. 10 trained tasters rate the sweetness before and after storage. The average difference (before – after) in the sweetness is 1.02 with a standard deviation 1.196

- a) Construct a 95% confidence interval for the average difference of sweetness.
- b) Are these data provide good evidence that the cola lost sweetness during storage?



$$\bar{x}$$
 = 1.02, s = 1.196, n = 10

 Construct a 95% confidence interval for the average difference of sweetness.

95% CI for
$$\mu$$
: $\bar{x} \pm (t_{df} \times \frac{s}{\sqrt{n}})$

Using scipy: from scipy.stats import t

$$(1.02+np.array([+1,-1])* t.ppf(0.975,9)*1.196/np.sqrt(10)) = (0.16, 1.88)$$

b) Are these data provide good evidence that the cola lost sweetness during storage?

Yes, since the values in the CI are positive (more than 0)

Forward School

CI for two independent samples

Comparing:

- the responses to two treatments or
- the characteristics of two populations

There is

- a separate sample from each treatment or each population.
- individual measurements are not matched, and
- the samples can be of differing sizes or same size
- We are interested in the difference between the means (μ_a - μ_b)



CI for $\mu_a - \mu_b$

Two cases:

Equal variances / common population variance / constant variance
 / pooled variance

2) Unequal variances / unpooled variance

We can conduct a test to check which is the correct case. However we will not discuss it here.



CI for μ_a - μ_b

 Equal variance / common population variance / constant variance / pooled variance

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

CI for
$$\mu_1$$
- μ_2 : $(\overline{x}_a - \overline{x}_b) \pm t_{df}(s_p) \sqrt{\frac{1}{n_a} + \frac{1}{n_b}}$

$$df = n_a + n_b - 2$$



- Twelve randomly selected mature citrus trees of one variety have a mean height of 13.8 feet with a standard deviation of 1.2 feet, and fifteen randomly selected mature citrus trees of another variety have a mean height of 12.9 feet with a standard deviation of 1.5 feet.
- Assuming that the random samples were selected from normal populations with common variance. Construct a 90% confidence interval for the difference between the true average heights of the two kinds of citrus trees.

$$n_a = 12$$
, $\overline{x}_a = 13.8$, $s_a = 1.2$

$$n_b = 15$$
, $\overline{x}_b = 12.9$, $s_b = 1.5$



$$\begin{split} &n_a = 12, \quad \overline{x}_a = 13.8, \quad s_a = 1.2 \\ &n_b = 15, \quad \overline{x}_b = 12.9, \quad s_b = 1.5 \\ &s_p^2 = \frac{(n_a - 1)s_a^2 + (n_b - 1)s_b^2}{n_a + n_b - 2} = \frac{(11)(1.2)^2 + (14)(1.5)^2}{25} \end{split}$$

90% CI for μ_a - μ_b :

$$(\overline{x}_{a} - \overline{x}_{b}) \pm t_{n_{a}+n_{b}-2}(s_{p}) \sqrt{\frac{1}{n_{a}} + \frac{1}{n_{b}}}$$

$$(13.8 - 12.9) \pm t_{df=25}(s_{p}) \sqrt{\frac{1}{12} + \frac{1}{15}}$$



R output:

$$s_p^2 = 1.8936$$

90% CI for μ_a - μ_b :

(13.8-12.9)+np.array([+1,-1])*t.ppf(0.95,25)*np.sqrt(1.8936)*np.sqrt(1/12+1/15)*np.sqrt

$$= (-0.01, 1.81)$$



Quiz

