



# Data Science Bootcamp

## <> Hypothesis Testing in Statistics



# Essential Knowledge



Data  
Analyst

- Descriptive
- Inferential
  - Hypothesis Test/ Basic Model
    - T-Test
    - F-Test
    - Correlation
    - Linear Regression
    - Logistic Regression



# Content

- Review 3 Ways to do Hypothesis Tests
  - Critical Region
  - p-value
  - Confidence Interval
- Limitation of p-value



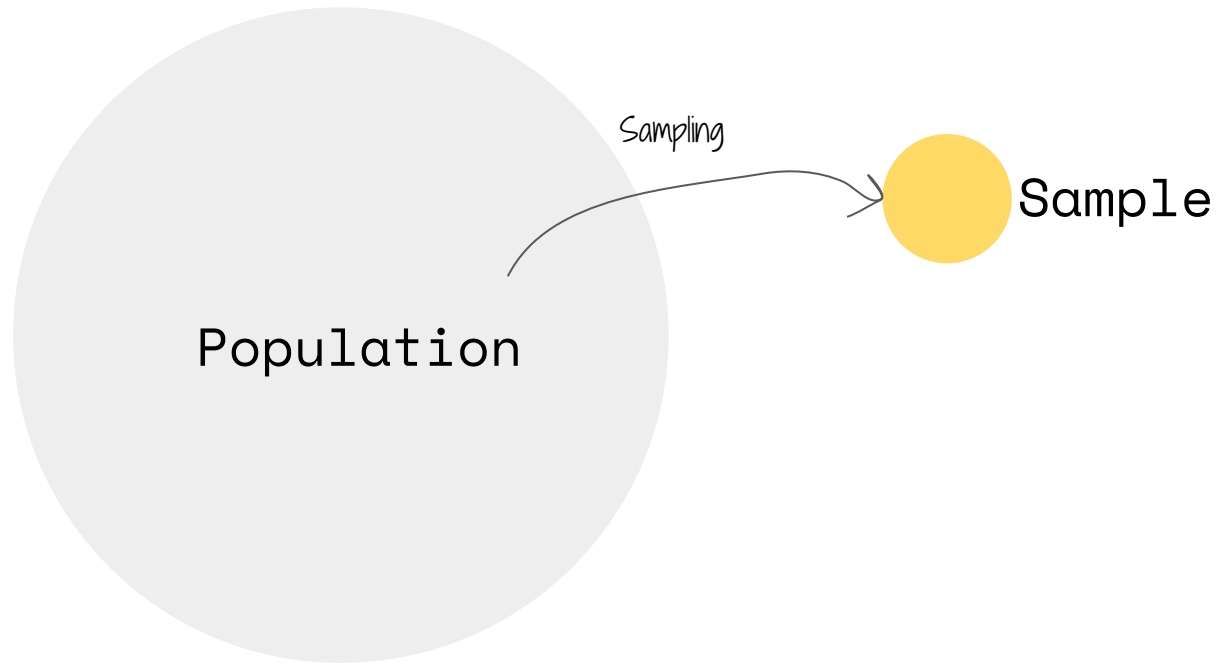
The earth is round  
(p-value < 0.05)

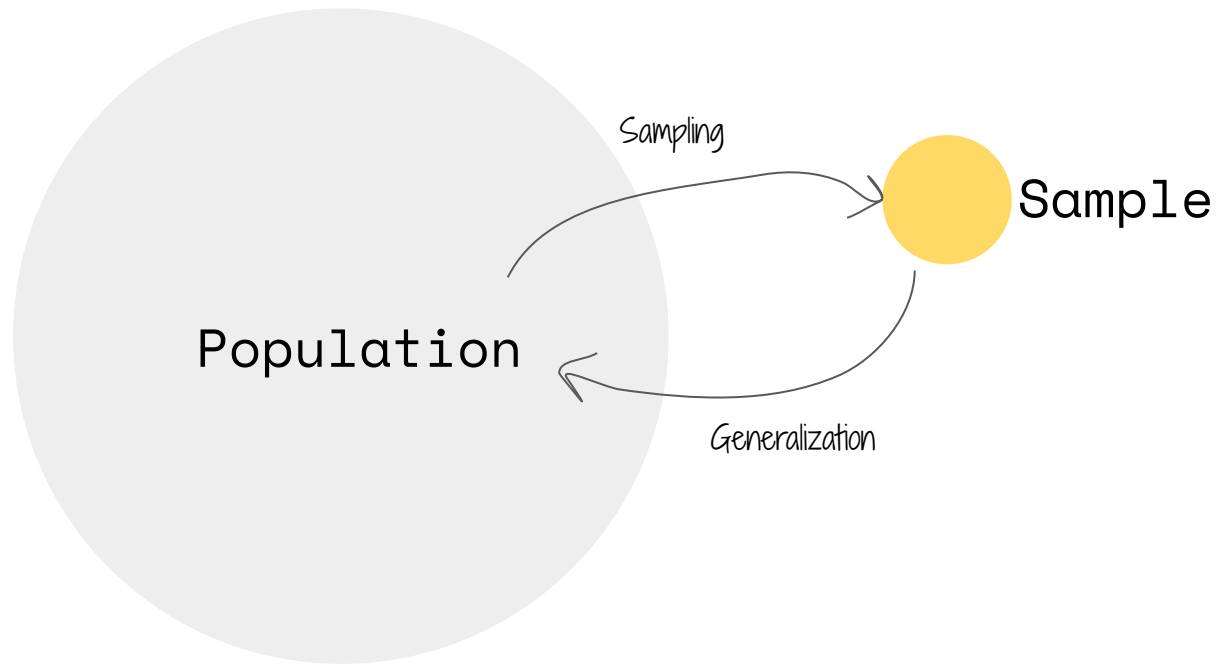




# Recap Core Concepts







<https://www.investopedia.com> › ... › Tools ⋮

## Hypothesis Testing Definition - Investopedia

Hypothesis testing is **an act in statistics whereby an analyst tests an assumption regarding a population parameter**. The methodology employed by the analyst ...







# Two Types of Testing

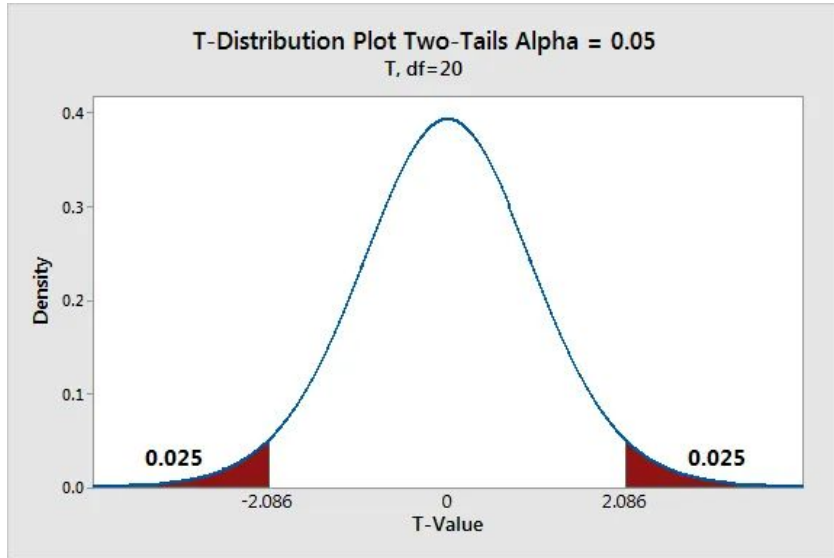


# Hypothesis Tests

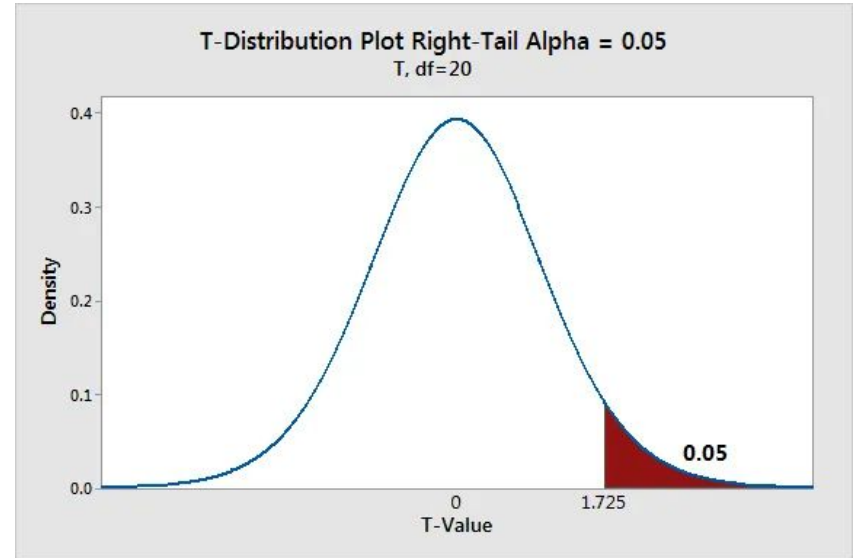
- One tailed test
- Two tailed test



## Two-Tailed Test



## One-Tailed Test

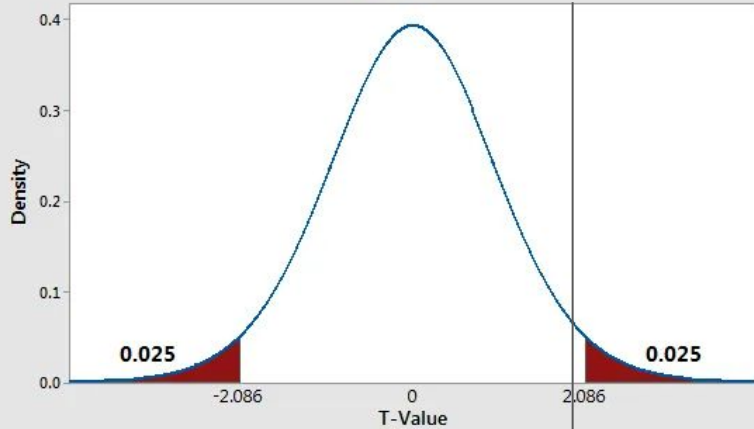


<https://statisticsbyjim.com/hypothesis-testing/one-tailed-two-tailed-hypothesis-tests/>



T-Distribution Plot Two-Tails Alpha = 0.05

T, df=20



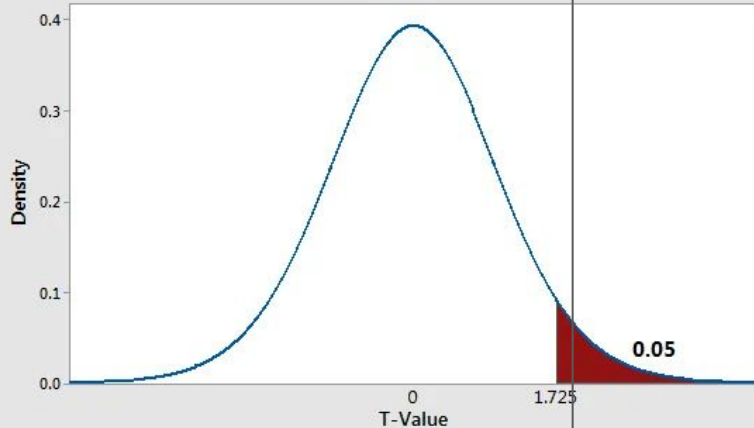
## Two tailed test

$H_0: \text{mean } A - \text{mean } B = 0$

$H_a: \text{mean } A - \text{mean } B \neq 0$

T-Distribution Plot Right-Tail Alpha = 0.05

T, df=20



## One tailed test

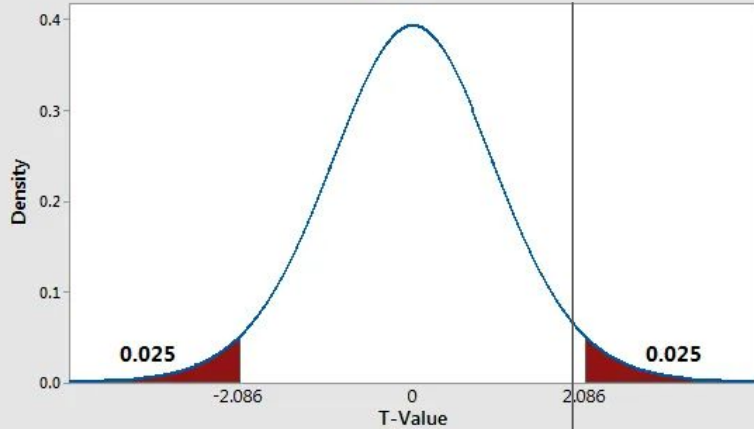
$H_0: \text{mean } A - \text{mean } B \leq 0$

$H_a: \text{mean } A - \text{mean } B > 0$



T-Distribution Plot Two-Tails Alpha = 0.05

T, df=20



## Two tailed test

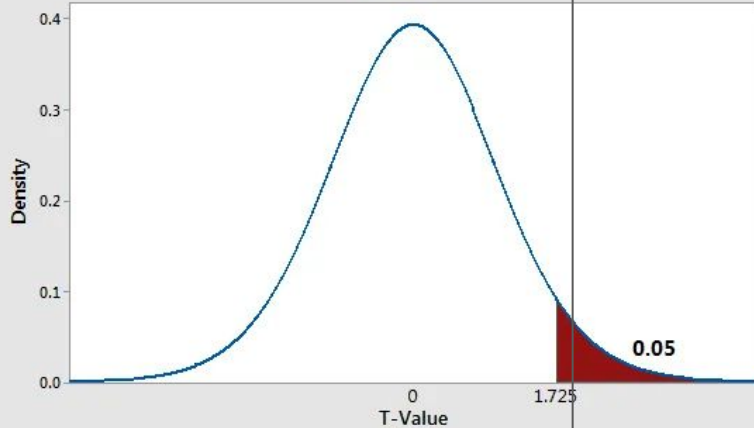
$H_0: \text{mean A} - \text{mean B} = 0$

$H_a: \text{mean A} - \text{mean B} \neq 0$

Conclusion: Fail to Reject  $H_0$

T-Distribution Plot Right-Tail Alpha = 0.05

T, df=20



## One tailed test

$H_0: \text{mean A} - \text{mean B} \leq 0$

$H_a: \text{mean A} - \text{mean B} > 0$

Conclusion: Reject  $H_0$





# Two Types of Error



# Things can go wrong

	Reject $H_0$	Do not reject $H_0$
$H_0$ is TRUE	Type 1 <False Positive>	True Negative
$H_0$ is FALSE	True Positive	Type 2 <False Negative>



Alpha

(0.05)

Reject  $H_0$

Do not reject  $H_0$

$H_0$  is TRUE

Type 1  
<False Positive>

True Negative

$H_0$  is FALSE

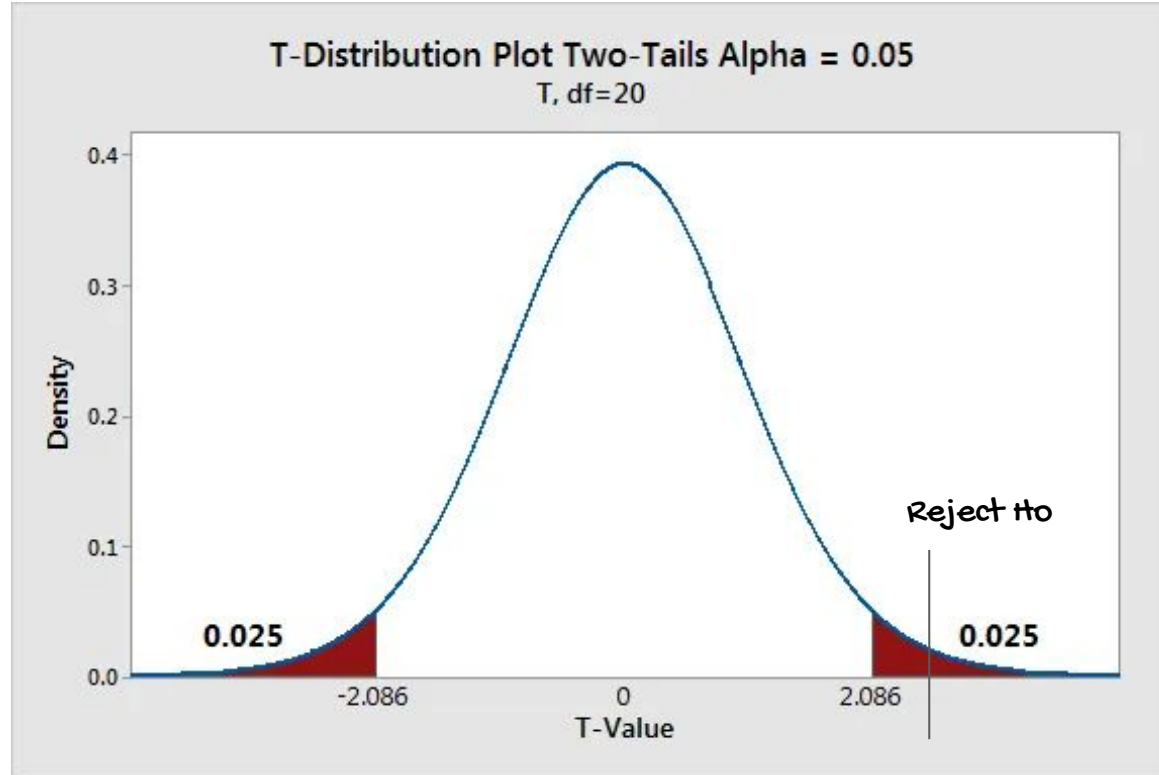
True Positive

Type 2  
<False Negative>

Beta







When we reject  $H_0$ , we  
control **the alpha**  $\leq 5\%$ .



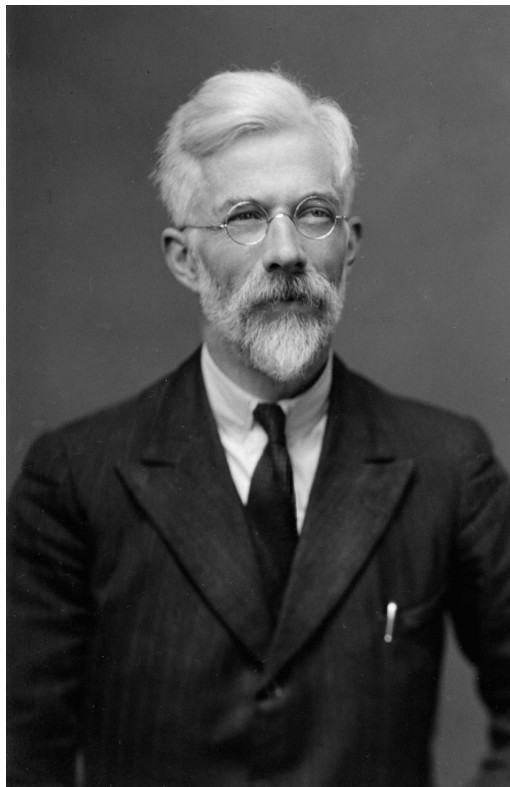
$1 - \alpha = \text{confidence level}$





# Hypothesis Testing





Frequentist School

Ronald Fisher  
1890 - 1962

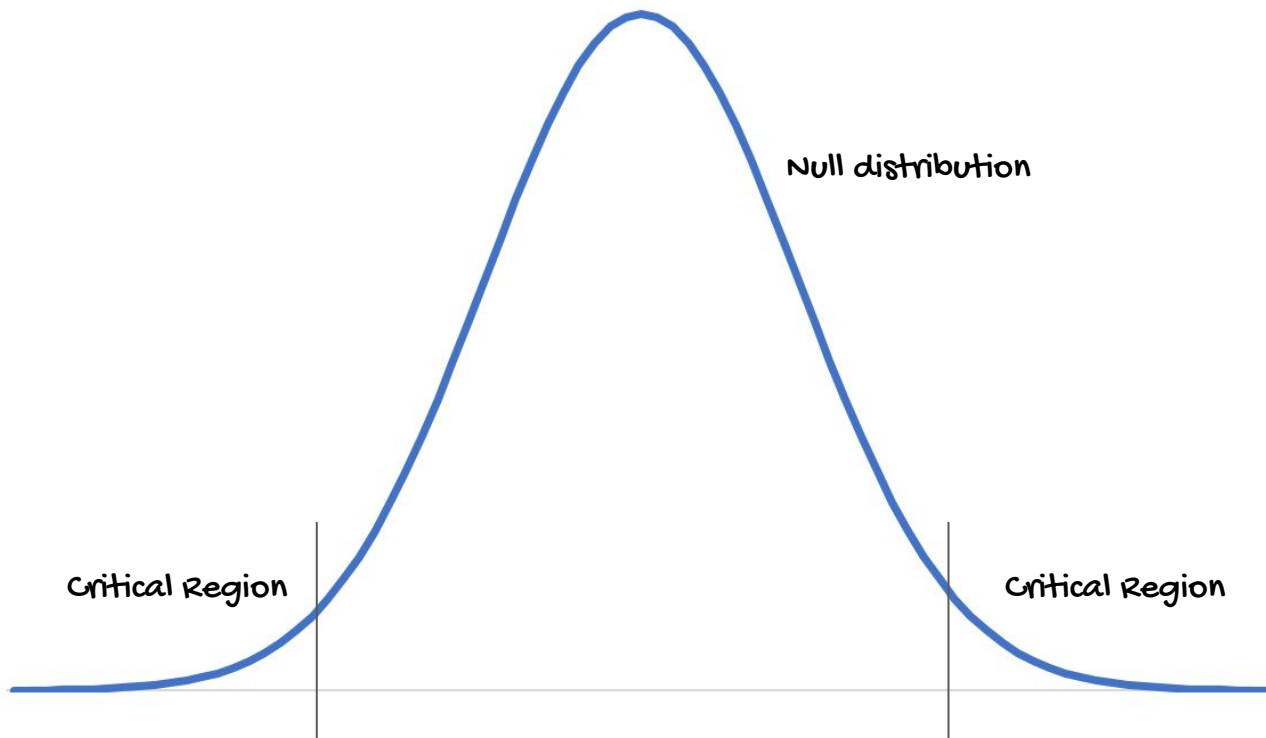


# 3 Ways to Test

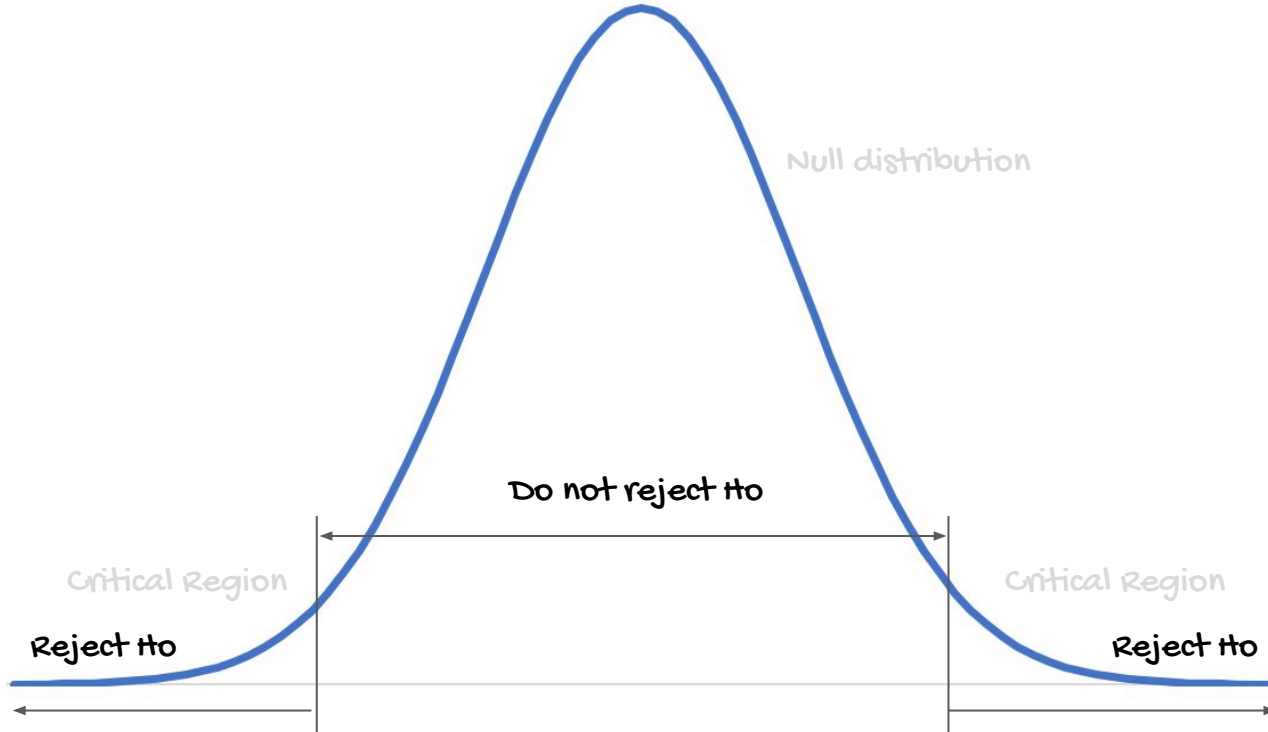
- Critical Region
- p-value
- Confidence Interval



# 1. Critical Region 🔥

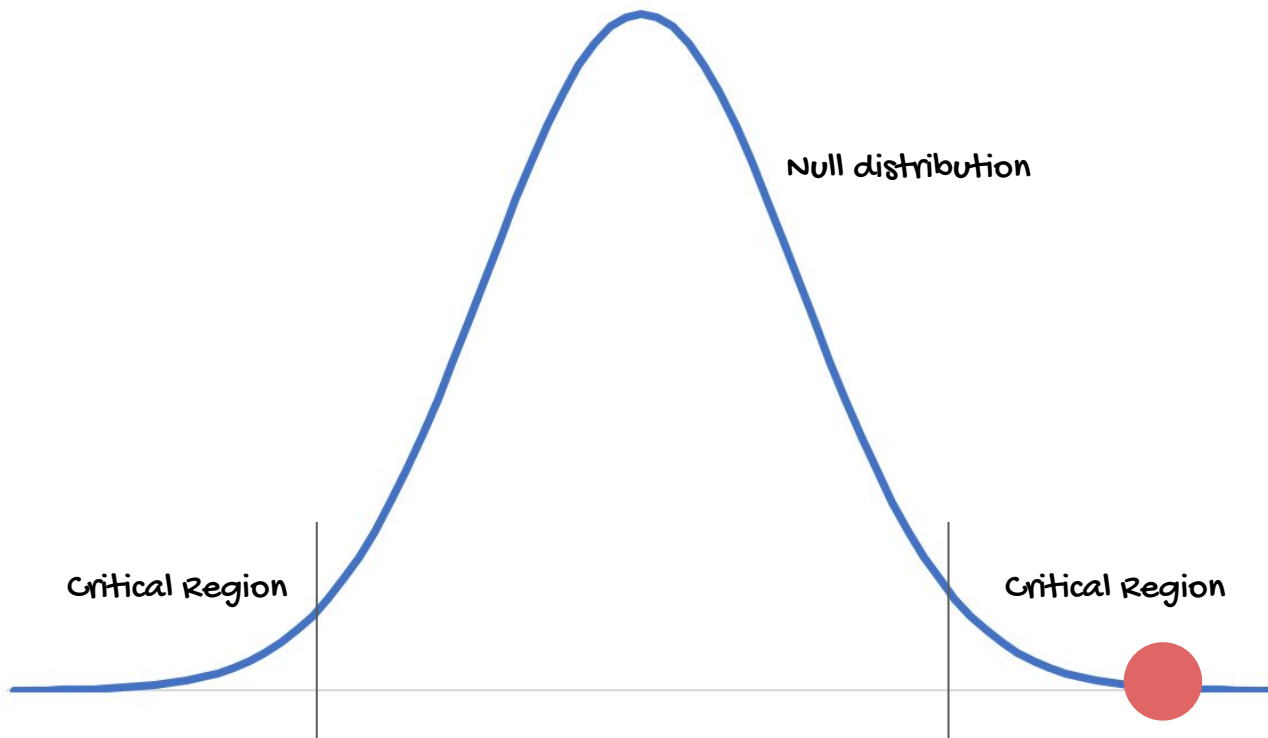


# 1. Critical Region 🔥

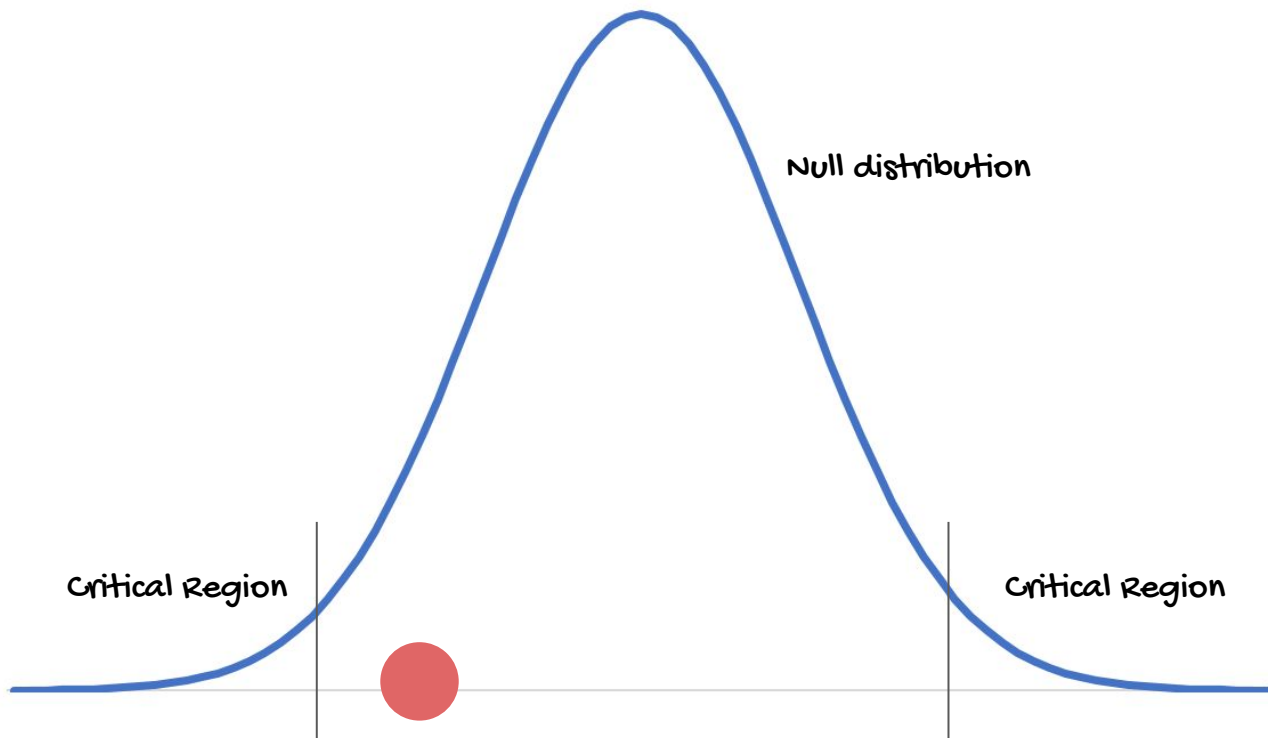




# 1. Critical Region 🔥



# 1. Critical Region 🔥



## 2. p-value 🔥

$p(\text{observed data or more extreme} \mid \text{Ho is TRUE})$

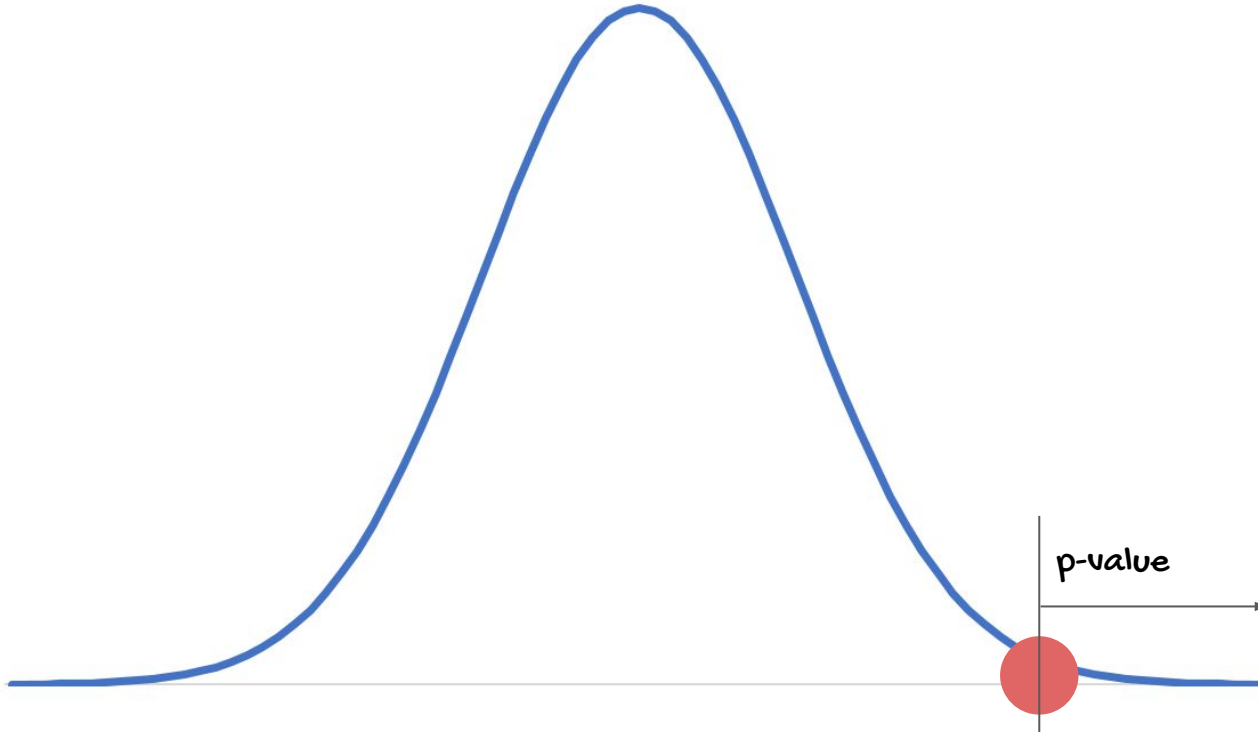
Assuming  $H_0$  is true

probability

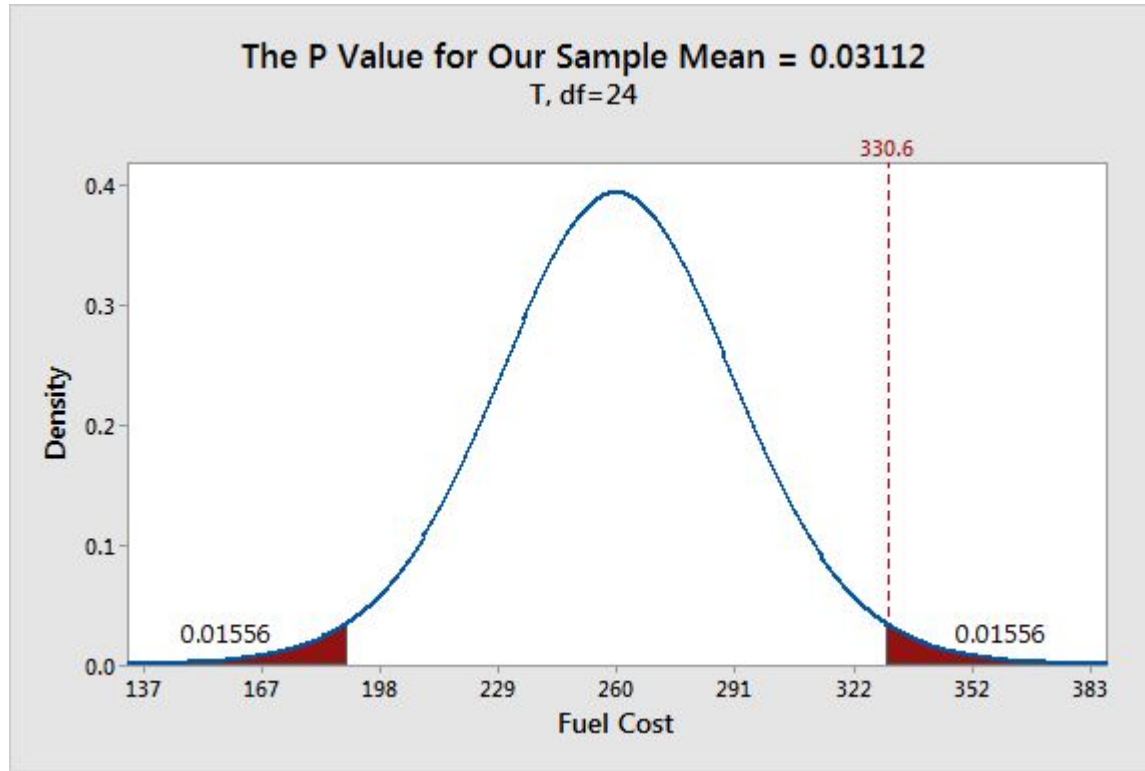
Given



## 2. p-value 🔥



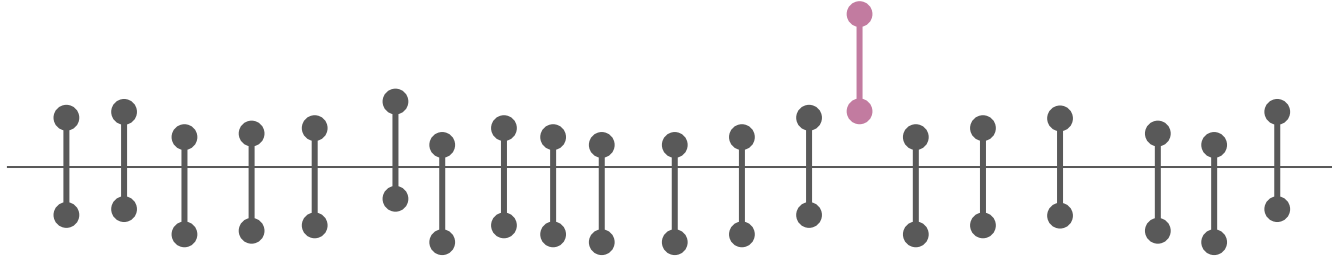
$$p\text{-value} = 0.01556 * 2 = 0.03112$$



# 3. Confidence Interval 🔥

$19/20 = 0.95 = 95\%$  confidence

True  
parameter



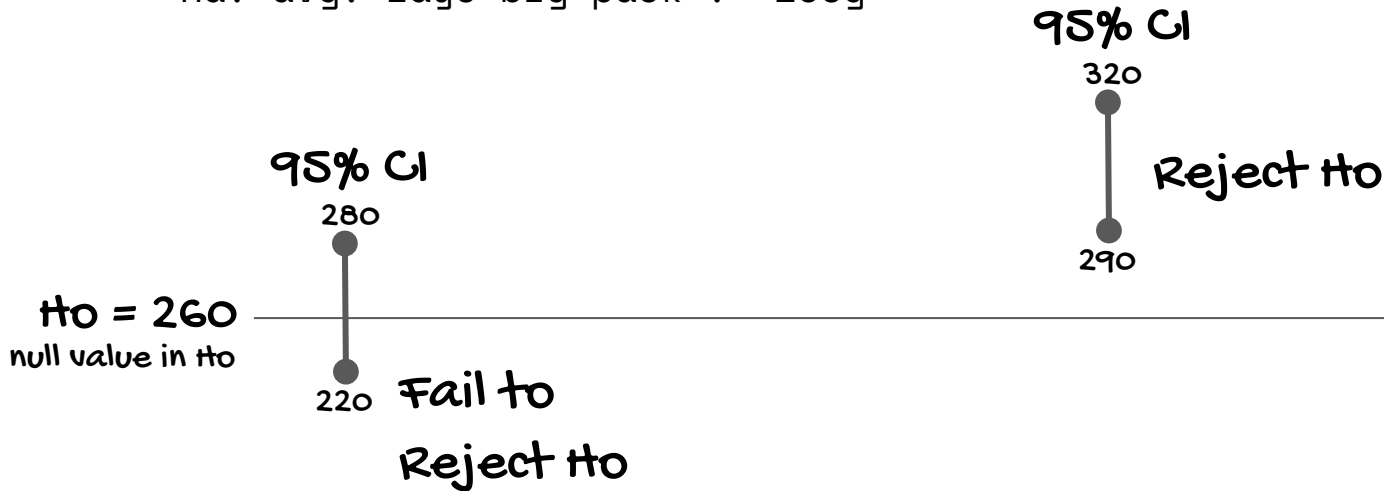
# 3. Confidence Interval 🔥



# 3. Confidence Interval 🔥

$H_0$ : avg. lays big pack = 260g

$H_a$ : avg. lays big pack  $\neq$  260g





# 3. Confidence Interval 🔥

Ho: mean diff = 0

Ha: mean diff != 0

$\mu_0 = 0$

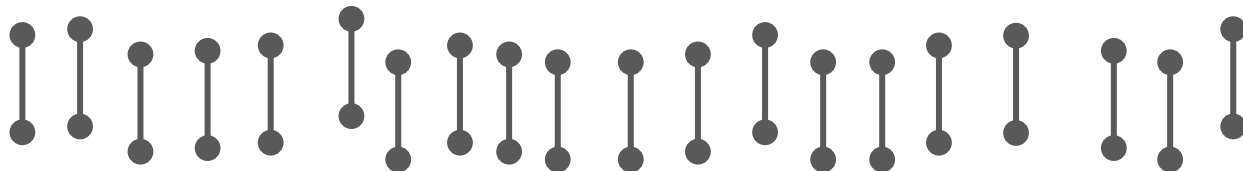
null value in  $\mu_0$

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# 3. Confidence Interval 🔥

Ho: mean diff = 0  
Ha: mean diff != 0



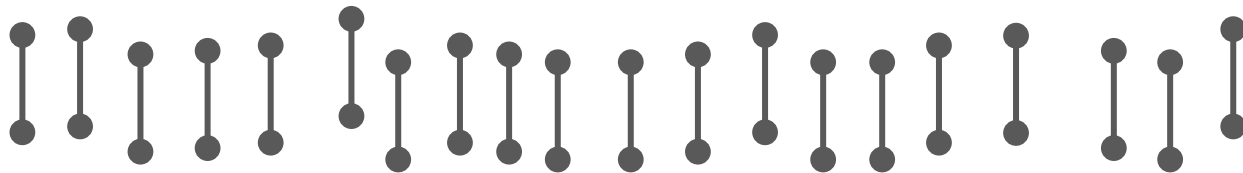
null value in Ho

95% CI **[1.2, 3.5]** => ???



# 3. Confidence Interval 🔥

Ho: mean diff = 0  
Ha: mean diff != 0

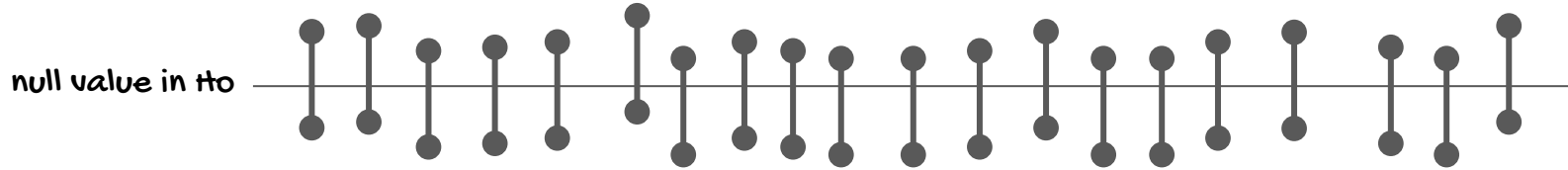


95% CI **[1.2, 3.5]** => Reject Ho



# 3. Confidence Interval 🔥

Ho: mean diff = 0  
Ha: mean diff != 0




95% CI **[-0.9, 1.5]** => Do Not Reject Ho



# The same conclusion

- If our data falls in critical region
  - $p\text{-value} \leq 0.05$
  - 95% CI *will not* contain null value

 Reject  $H_0$

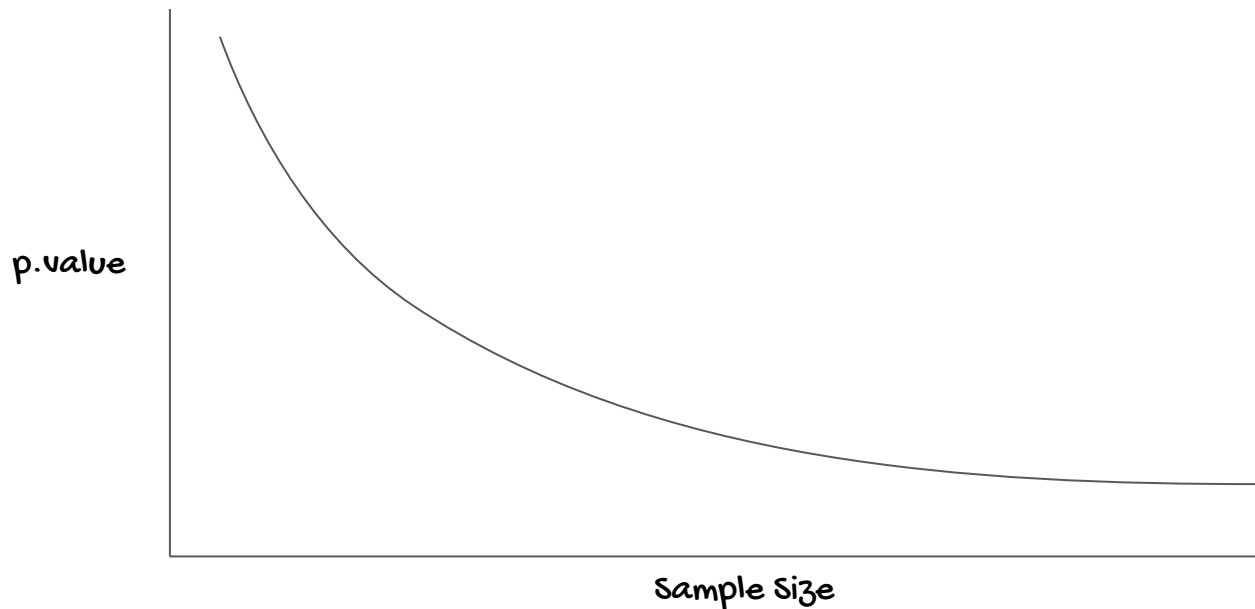


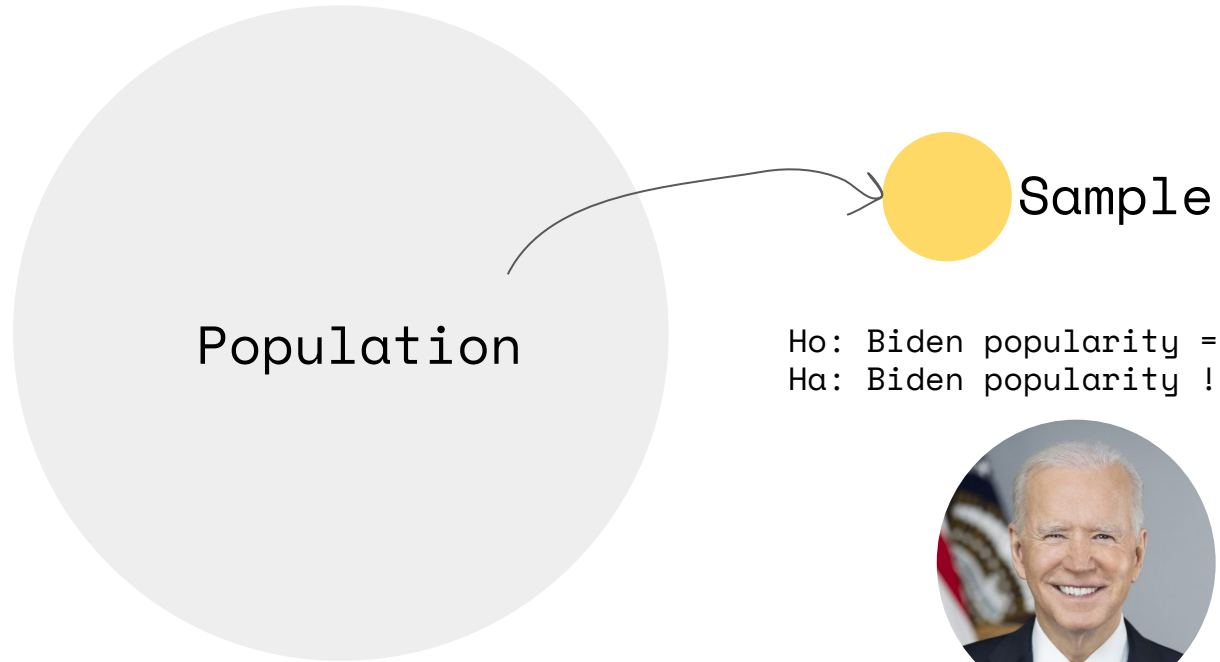


# Limitation of p-value



p-value is sensitive to  
**sample size**

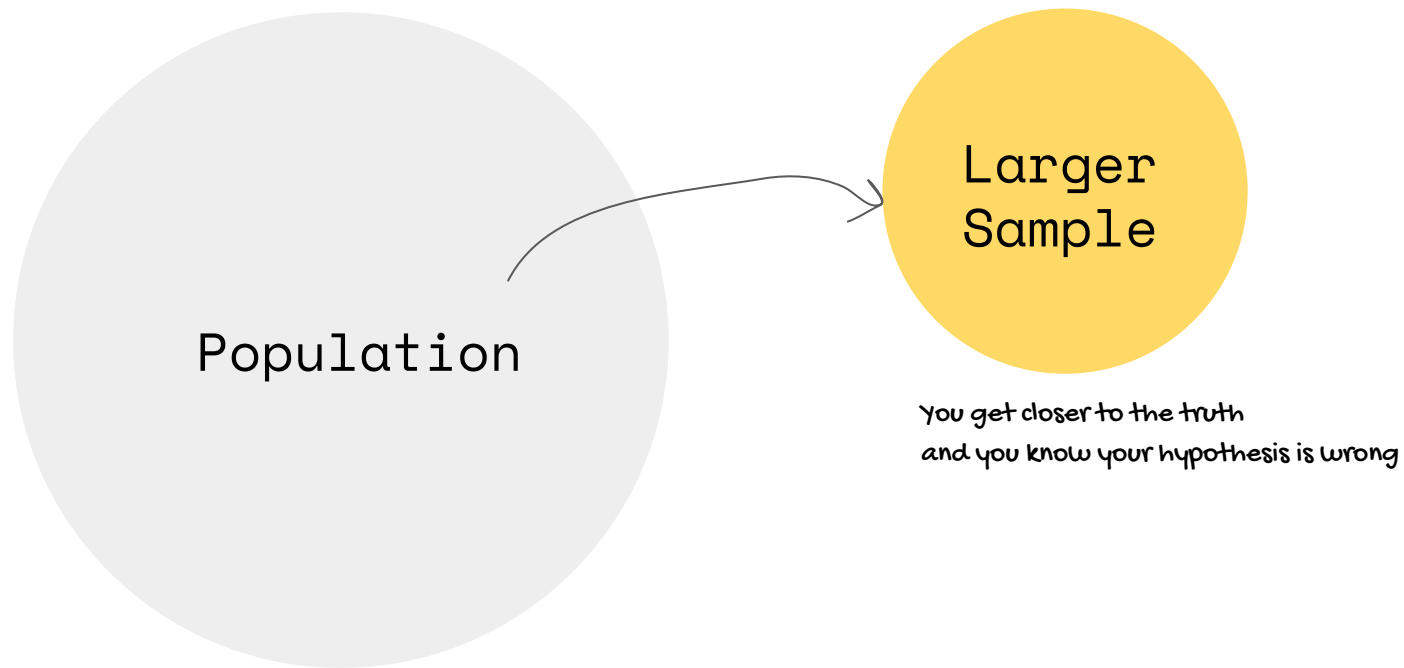


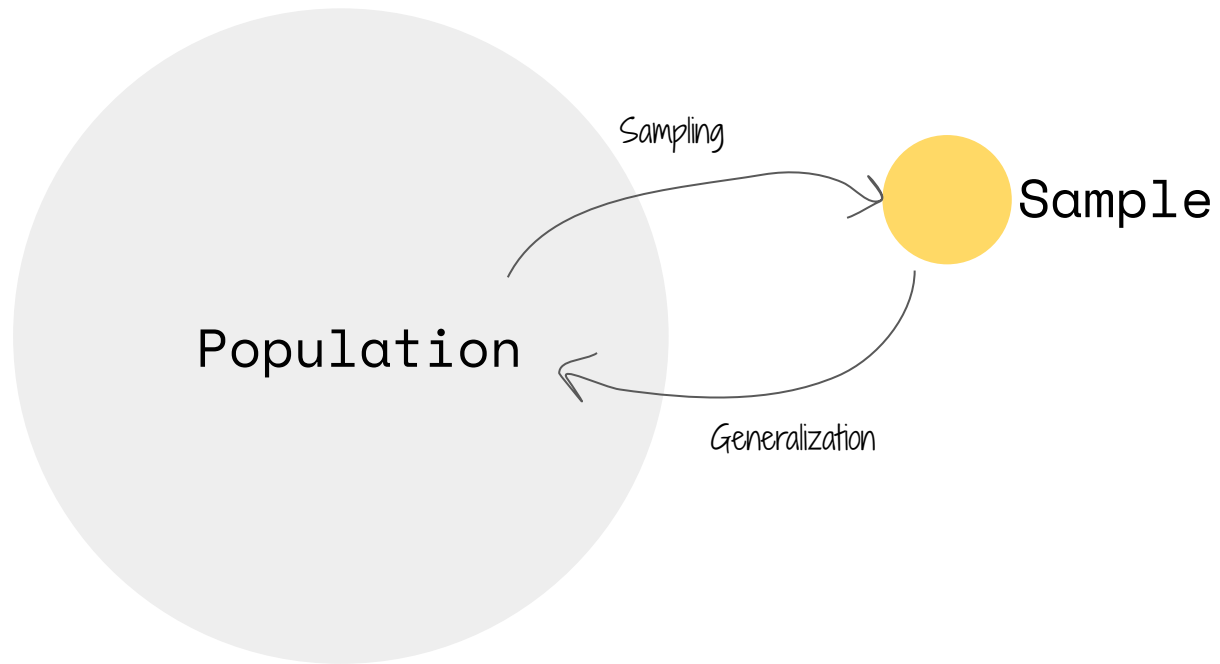


Ho: Biden popularity = 70%  
Ha: Biden popularity != 70%









Hypothesis test tests whether **the difference exists**,  
but does not test **the impact** of the difference.

↖  
Effect size



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## The Earth Is Round ( $p < .05$ )

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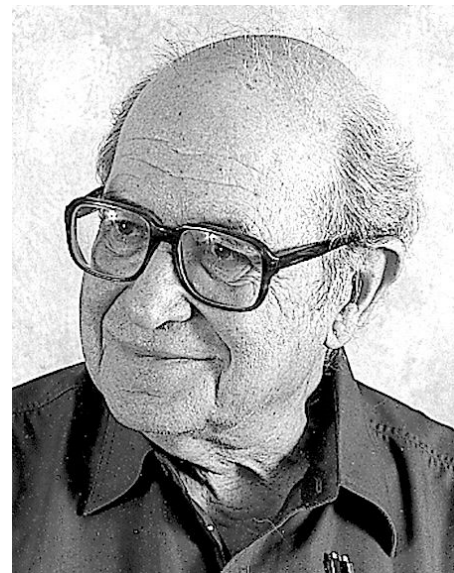
Jacob Cohen

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*After 4 decades of severe criticism, the ritual of null hypothesis significance testing—mechanical dichotomous decisions around a sacred .05 criterion—still persists. This article reviews the problems with this practice, including its near-universal misinterpretation of  $p$  as the probability that  $H_0$  is false, the misinterpretation that its complement is the probability of successful replication, and the mistaken assumption that if one rejects  $H_0$  one thereby affirms the theory that led to the test. Exploratory data analysis and the use of graphic methods, a steady improvement in and a movement toward standardization in measurement, an emphasis on estimating effect sizes using confidence intervals, and the informed use of available statistical methods is suggested. For generalization, psychologists must finally rely, as has been done in all the older sciences, on replication.*

sure how to test  $H_0$ , chi-square with Yates's (1951) correction or the Fisher exact test, and wonders whether he has enough power. Would you believe it? And would you believe that if he tried to publish this result without a significance test, one or more reviewers might complain? It could happen.

Almost a quarter of a century ago, a couple of sociologists, D. E. Morrison and R. E. Henkel (1970), edited a book entitled *The Significance Test Controversy*. Among the contributors were Bill Rozeboom (1960), Paul Meehl (1967), David Bakan (1966), and David Lykken (1968). Without exception, they damned NHST. For example, Meehl described NHST as “a potent but sterile intellectual rake who leaves in his merry path a long train of ravished maidens but no viable scientific offspring” (p. 265). They were, however, by no means the first to do so. Joseph Berkson attacked NHST in 1938, even before it



Jacob Cohen



Ho: earth is round (equal  $r = 100,000\text{km}$ )  
Ha: earth is not round



Ho : โลกเป็นรูปไข่  
Ha : โลกไม่ใช่รูปไข่





# Course Recap



# Key Takeaways

- All methods produce the same result
  - Critical region
  - p-value
  - Confidence interval
- Confidence interval is highly recommended in modern research
- p-value is sensitive to sample size







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