# **Estimation and Hypothesis Testing**

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- Central Limit Theorem & Assumptions
- Estimation and Confidence Intervals
- Null and Alternative Hypotheses
- Hypothesis Testing Steps
- One-tailed and Two-tailed Tests
- Type I and Type II Errors

**Agenda** 

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# Let's begin the discussion by answering a few questions on estimation and hypothesis testing.



What does the Central Limit Theorem state about the sampling distribution of the sample mean?

- A It will always be skewed
- B It will be identical to the population distribution

c It will approach a normal distribution as the sample size increases

It will be uniformly distributed irrespective of the sample size



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### **Sampling and Sampling Distributions**



Sampling is a **technique of selecting a subset of the population** to make statistical inferences from them and estimate the characteristics of the whole population.

Needed as we have **limited resources and time**, so it's **not always possible to study the population** 

We can draw multiple samples from a population

For each sample we can compute a statistic (mean, median, standard deviation)

Sampling Distribution is the distribution of the statistic computed from all possible samples drawn from a specific population

### **Central Limit Theorem**



The sampling distribution of the sample means will approach normal distribution as the sample size gets bigger, no matter what the shape of the population distribution is.

As the sample size increases, the shape of the distribution approaches a normal distribution

Let's see CLT in action via a <u>simulation</u>





Which of the following is generally considered a sufficiently large sample size for the Central Limit Theorem to hold true?

- A Greater than or equal to 10
- Greater than or equal to 50

**c** Greater than or equal to 30

D Greater than or equal to 40





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#### **Assumptions of Central Limit Theorem:**

Data must be randomly sampled

Sample size must be sufficiently large (≥30)

Samples should come from the same distribution

Sample values must be **independent** of each other



#### What does a confidence interval represent in statistics?

- A The range of sample values
- B The range within which the true population parameter is expected to lie

**c** The variability of the sample data

The exact value of the population mean





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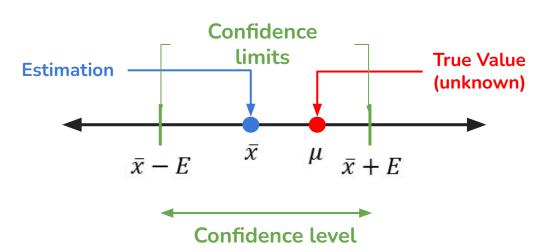
### **Estimation & Confidence Intervals**



Estimation refers to making inference about a population parameter based on sample statistic

Confidence interval provides an interval, or a range of values, which is expected to cover the true unknown parameter

The upper and lower limits of the interval are determined using the distribution of the sample mean and a multiplier that specifies the 'confidence'







A manufacturer wants to test if the average lifetime of light bulbs exceeds 1000 hours. With a sample of 40 bulbs, the mean lifetime is found to be 1020 hours and a standard deviation of 50 hours.

Which of the following represents the correct null and alternative hypotheses for this scenario?

- **A** H0:  $\mu$  = 1020, Ha:  $\mu \neq$  1020
- B H0: μ = 1000, Ha: μ ≠ 1000
- **c** H0:  $\mu \le 1000$ , Ha:  $\mu > 1000$
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### **Hypothesis Testing - Introduction**



#### **Question of Interest**

Has the new online Ad increased the conversion rates for an E-commerce website?



### Null Hypothesis (H<sub>0</sub>)

The status quo

The new Ad has not increased the conversion rate.

### Alternative Hypothesis (H<sub>a</sub>)

The research hypothesis

The new Ad has increased the conversion rate.

### **Hypothesis Formulation**



Let  $\mu$  denote the population mean; the hypothesized value is 1000 hours; the sample mean is 1020 hours

We want to formulate the null and alternative hypotheses for testing if the average lifetime of light bulbs exceeds the hypothesized value (1000 hours)

The null hypothesis will represent the **status quo**, i.e., the **average lifetime does not exceed**1000 hours

 $H0: \mu \leq 1000$ 

The alternative hypothesis will represent the **research hypothesis**, i.e., the **average lifetime exceeds 1000 hours** 



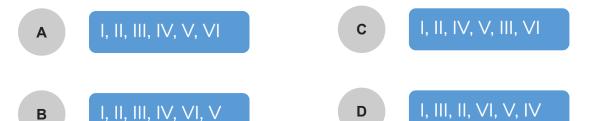


Which of the following option represents the correct sequence for hypothesis testing?

- I. Formulate H0 and Ha
- II. Set Level of Significance,  $\alpha$
- III. Select Appropriate Test
- IV. Reject or Do Not Reject HO
- V. Compare with  $\alpha$

В

VI. Determine p-value



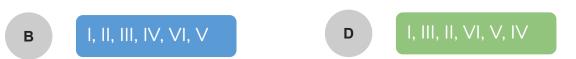




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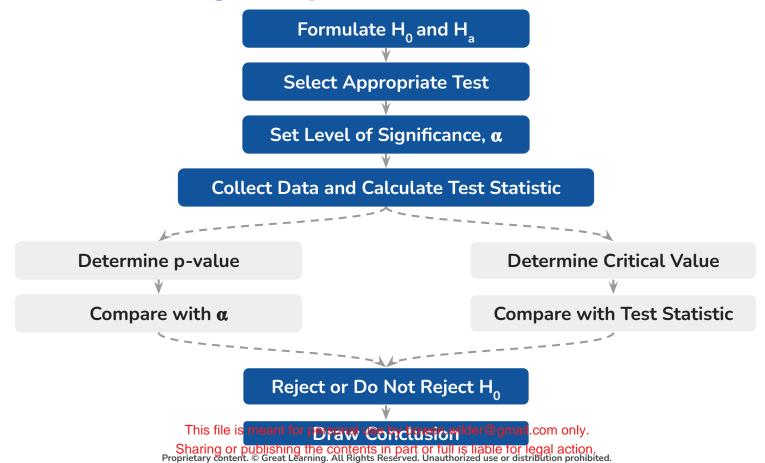
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### **Hypothesis Testing - Steps**









A pharmaceutical company is conducting a clinical trial to evaluate the effectiveness of a new drug for treating high blood pressure. The company wants to determine whether the drug has a significant impact on systolic blood pressure levels. Based on the alternative hypotheses below, which type of test should be used?

A: The new drug increases systolic blood pressure levels compared to the placebo.

B: The new drug has a different effect on systolic blood pressure levels compared to the placebo.

C: The new drug decreases systolic blood pressure levels compared to the placebo.

- A: One-tailed test, B: One-tailed test, C: Two-tailed test
- A: Two-tailed test, B: Two-tailed test, C: One-tailed test
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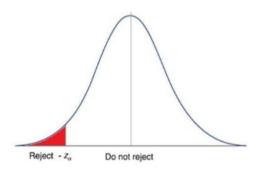
B: The new drug has a different effect on systolic blood pressure levels compared to the placebo.

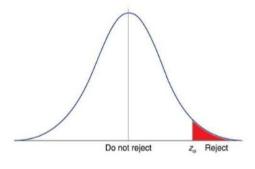
C: The new drug decreases systolic blood pressure levels compared to the placebo.

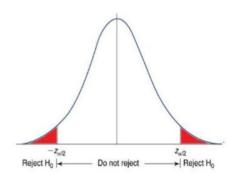
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### **One-tailed vs Two-tailed Tests**









- Lower tail test.
- H₁: µ < ......</li>

- Upper tail test.
- H₁: µ > ......

- Two tail test.
- H₁: µ ≠ ......

Reject H0 if the value of test statistic is too small

Reject H0 if the value of test statistic is too large

Reject H0 if the value of test statistic is either too small or too large



Which of the following statements correspond to Type-I and Type-II errors?

- A. A researcher is conducting a hypothesis test to check if a new drug significantly reduces cholesterol levels in patients, and concludes that it does reduce cholesterol levels when actually it has no effect.
- B. A company is conducting a hypothesis test to check if a new manufacturing process increases the lifespan of light bulbs, and it fails to conclude that the lifespan increases when it actually does.

A Both A and B are Type-I Errors

B is Type-I Error and A is Type-II Error

A is Type-I Error and B is Type-II Error

Both A and B are Type-II Errors

В

D



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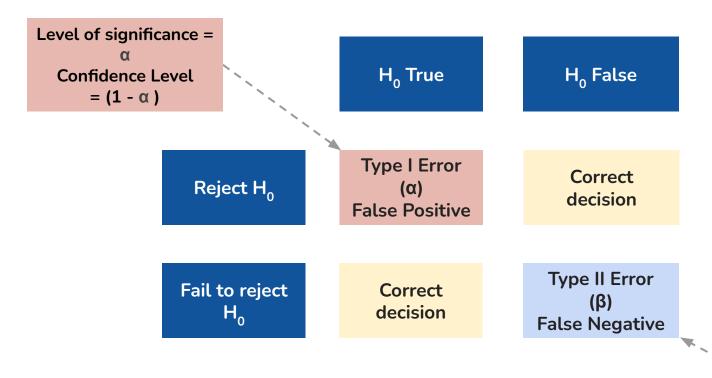
Both A and B are Type-II Errors

В

D

### **Type-I and Type-II Errors**





Power of the  $test = (1 - \beta)$ 

### **Type-I and Type-II Errors**



Scenario A: A researcher is conducting a hypothesis test to check if a **new drug significantly** reduces cholesterol levels in patients

H0: The new drug has no effect on cholesterol levels in patients

Ha: The new drug significantly reduces cholesterol levels in patients

The researcher concludes that it does reduce cholesterol levels, i.e., he rejects the null hypothesis

But the new drug actually has no effect, i.e., the null hypothesis was true

Rejected null hypothesis when it was true => Type-I Error

### **Type-I and Type-II Errors**



Scenario B: A company is conducting a hypothesis test to check if a new manufacturing process increases the lifespan of light bulbs

H0: The new manufacturing process has no effect on the lifespan of light bulbs.

Ha: The new manufacturing process increases the lifespan of light bulbs.

The company fails to conclude that the new process increases the lifespan of the light bulbs, i.e., company does **not reject the null hypothesis** 

But the new manufacturing process actually has the desired effect, i.e., the null hypothesis was false

Did not reject null hypothesis when it was false => Type-II Error



**Happy Learning!** 

