




## HYPOTHESIS TESTING

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Statistical Inference: Two statistical data can be numerically compared



Used to test whether results were obtained by luck or not.

# HYPOTHESIS TESTING

Hypothesis testing is used to test the validity of a claim (null hypothesis) that is made about a population using sample data.



# HYPOTHESIS TESTING

**Null Hypothesis  $H_0$**

**True until proven false**

Usually posits no relationship



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## Alternative Hypothesis

**Negation of null hypothesis**

Usually asserts specific relationship

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## Null Hypothesis $H_0$

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## Select Test

**Pick from vast library**

Know which one to choose

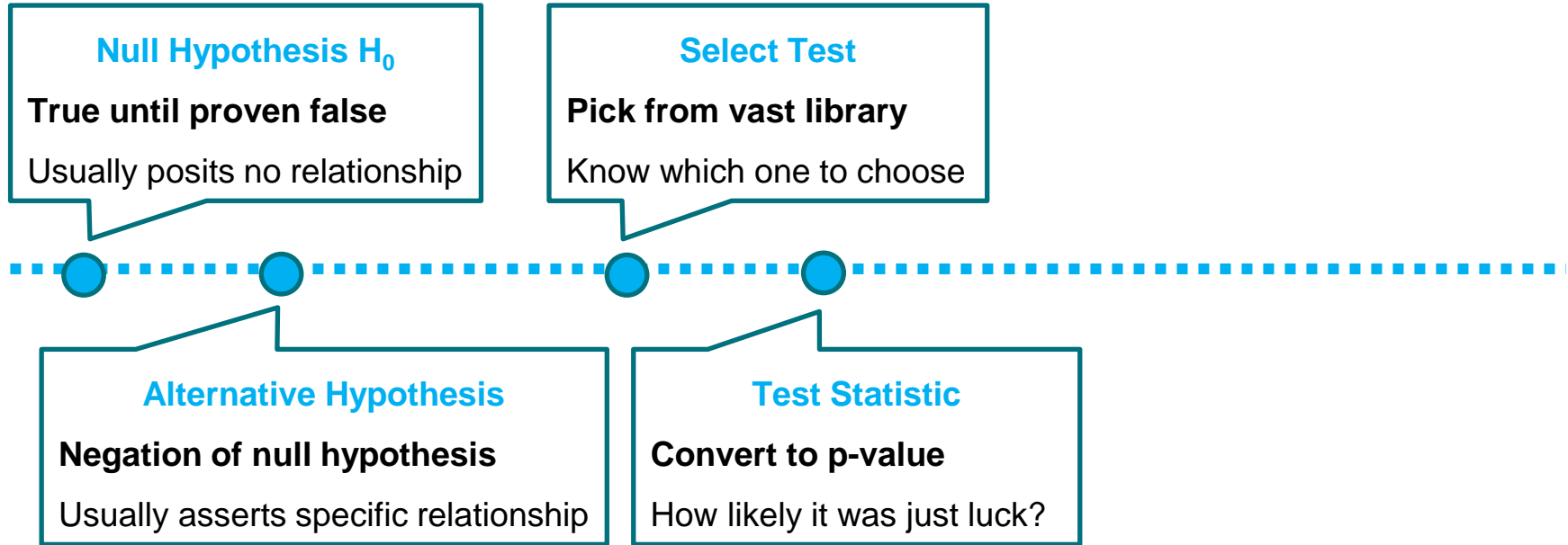
## Alternative Hypothesis

**Negation of null hypothesis**

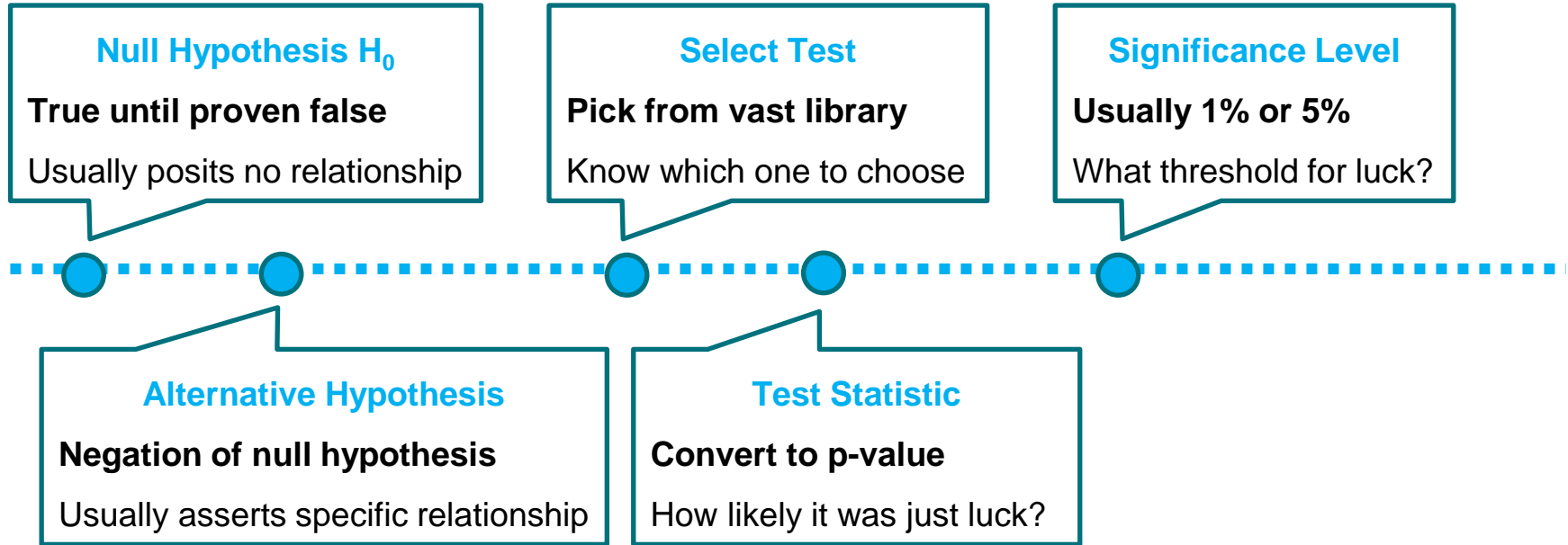
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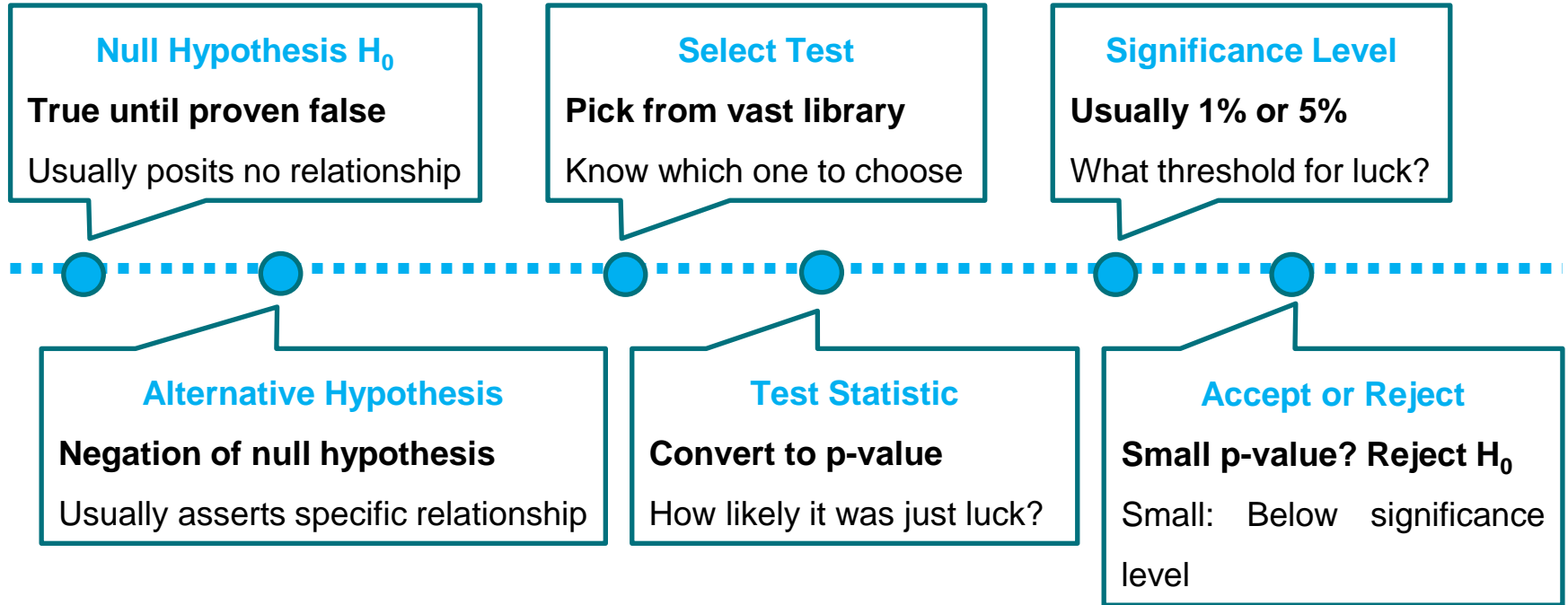


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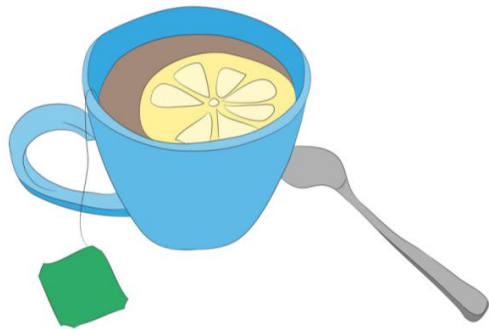




## LADY TESTING TEA

Famous experiment:

**Was tea added before or after milk?**



## LADY TESTING TEA

Null Hypothesis  
( $H_0$ )

The lady **cannot** tell if milk was  
poured first

Alternate Hypothesis  
( $H_1$ )

The lady **can** tell if milk was  
poured first



## LADY TESTING TEA

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( $H_0$ )

The lady **cannot** tell if milk was  
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Alternate Hypothesis  
( $H_1$ )

The lady **can** tell if milk was  
poured first

**It is good practice to assume that the null hypothesis is correct  
unless proven otherwise**



# LADY TESTING TEA

Null Hypothesis  $H_0$

**“Lady cannot tell difference”**

Can't tell if milk poured first





# LADY TESTING TEA

## Null Hypothesis $H_0$

**“Lady cannot tell difference”**

Can't tell if milk poured first



## Alternative Hypothesis

**“Lady can tell difference”**

Can indeed discern if milk poured first



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## Select Test

**8 cups, 4 of each type**

Lady got all 8 correct

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## Test Statistic

**p-value =  $1/70 = 1.4\%$**





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## Significance Level

**Choose 5% significance level**

Part of design of experiment

## Alternative Hypothesis

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**p-value =  $1/70 = 1.4\%$**



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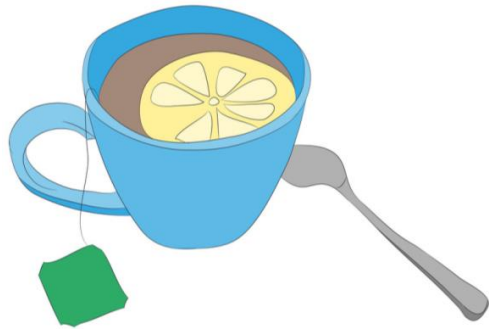
## Test Statistic

**p-value =  $1/70 = 1.4\%$**

## Accept or Reject

**$1.4\% < 5\% \rightarrow \text{Reject } H_0$**

Lady can indeed tell difference



## LADY TESTING TEA

**Experiment proved that she could**

		Decision about Null Hypothesis	
		REJECT	DON'T REJECT
Null Hypothesis is actually	TRUE	Type I error	Correct Inference
	FALSE	Correct Inference	Type II error

		Decision about Null Hypothesis	
		REJECT	DON'T REJECT
Null Hypothesis is actually	TRUE	Type I error	
	FALSE		

**Claim the lady can tell the difference based on spurious test results which are not statistically significant – False Positive**

		Decision about Null Hypothesis	
		REJECT	DON'T REJECT
Null Hypothesis is actually	TRUE		
	FALSE		Type II error

**Fail to realize that the test for the alternative hypothesis was statistically significant – False Negative**

## POWER of a Statistical Test

- Probability of rejecting  $H_0$  when  $H_1$  is true (high is good)

High statistical power implies low probability of Type-II error

## Alpha of a Statistical Test – Statistical Significance

- $\alpha$  is probability of rejecting  $H_0$  when  $H_0$  is true (low is good)

## p-value of a Statistical Test

- p-value is compared to  $\alpha$  to decide whether to accept  $H_0$
- p-value should be as small as possible (i.e. below  $\alpha$ -threshold)
- Typical thresholds are: reject null hypothesis if  $p < 1\%$  or  $p < 5\%$

## T-test

Used to learn about differences in averages across two categories.

Example:

Average male baby birth weight =  
Average female baby birth weight?

Outputs:

**t-statistic:** score which indicate how different the means are;

**p-value:** whether the t-statistic is significant or not. Low values of p means that the result cannot have happened by chance.



## One-sample t-test

### Example:

Imagine your provider says that a specific product has an average size of 30mm.

Your procedure would be:

Claim that the null-hypothesis is:  
**The mean size of the population is equal to 30mm. ( $H_0: \mu = 30\text{mm}$ )**

**You run the t-test and if the p-value is less than 0.05 (5%), you would have 95% confidence that the null-hypothesis could be rejected. That is: 95% confidence that the product DOES NOT have an average of 30mm. ( $H_1: \mu \neq 30\text{mm}$ )**

## Two sample location test

### Example:

AB-Testing.

Imagine you have an information of a group and then you perform an **intervention**.

You want to test whether the means of your **control group** is statistically significantly different from your **treated group**.

Basically, you are testing a one-sample t-test for the difference on their means.

## ANOVA Analysis of Variance

### Example:

You have more than two categories to check.

**In the case that you have more than two categories to compare the means, the way to it is to use the analysis of variance.**

**This will only tell you whether there is some difference in some group. It will not tell you where the difference is.**

**Then you'd have to run multiple paired tests for each pair of categories.**

