



JANUARY, 2020 | BRAZIL

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True until proven false

Usually posits no relationship

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**Negation of null hypothesis** 

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**Select Test** 

**Pick from vast library** 

Know which one to choose

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**Test Statistic** 

Convert to p-value

How likely it was just luck?

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Know which one to choose

**Significance Level** 

Usually 1% or 5%

What threshold for luck?

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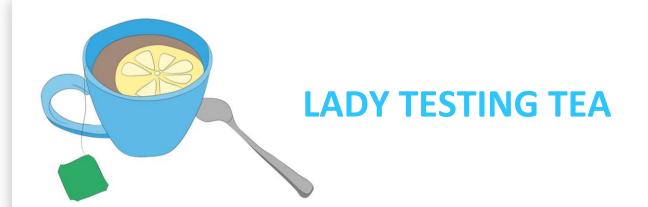
How likely it was just luck?

**Accept or Reject** 

Small p-value? Reject H<sub>0</sub>

Small: Below significance

level



Famous experiment:

Was tea added before or after milk?



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

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

Alternate Hypothesis (H<sub>1</sub>)

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



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

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

Alternate Hypothesis (H<sub>1</sub>)

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

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



## **Null Hypothesis H<sub>0</sub>**

"Lady cannot tell difference"

Can't tell if milk poured first



## **Null Hypothesis H<sub>0</sub>**

"Lady cannot tell difference"

Can't tell if milk poured first

#### **Alternative Hypothesis**

"Lady can tell difference"

Can indeed discern if milk poured first



### **Null Hypothesis H<sub>0</sub>**

"Lady cannot tell difference"

Can't tell if milk poured first

#### **Select Test**

8 cups, 4 of each type

Lady got all 8 correct

#### **Alternative Hypothesis**

"Lady can tell difference"

Can indeed discern if milk poured first



#### **Null Hypothesis H<sub>0</sub>**

"Lady cannot tell difference"

Can't tell if milk poured first

#### **Select Test**

8 cups, 4 of each type

Lady got all 8 correct

## **Alternative Hypothesis**

"Lady can tell difference"

Can indeed discern if milk poured first

#### **Test Statistic**

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

 ${}^{8}C_{4} = 70$  combinations



#### **Null Hypothesis H<sub>0</sub>**

"Lady cannot tell difference"

Can't tell if milk poured first

#### **Select Test**

8 cups, 4 of each type

Lady got all 8 correct

#### **Significance Level**

**Choose 5% significance level** 

Part of design of experiment

## **Alternative Hypothesis**

"Lady can tell difference"

Can indeed discern if milk poured first

#### **Test Statistic**

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

 ${}^{8}C_{4} = 70$  combinations



#### **Null Hypothesis H**<sub>0</sub>

"Lady cannot tell difference"

Can't tell if milk poured first

#### **Select Test**

8 cups, 4 of each type

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#### **Significance Level**

**Choose 5% significance level** 

Part of design of experiment

## **Alternative Hypothesis**

"Lady can tell difference"

Can indeed discern if milk poured first

#### **Test Statistic**

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

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#### **Accept or Reject**

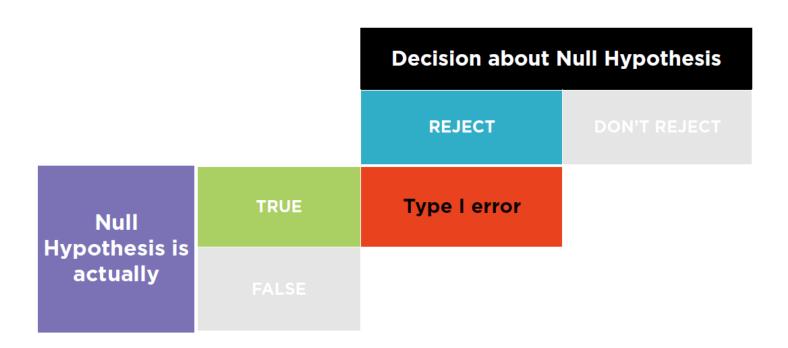
 $1.4\% < 5\% \rightarrow \text{Reject H}_0$ 

Lady can indeed tell difference

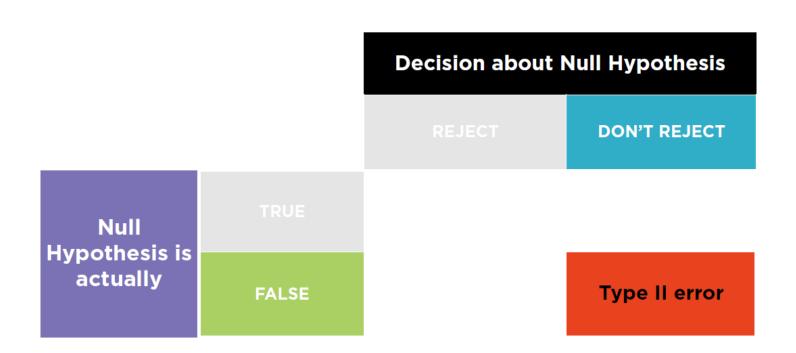


# **Experiment proved that she could**

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



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



Fail to realize that the test for the alternative hypothesis was statistically significant

## **POWER of a Statistical Test**

- Probability of rejecting Ho when H1 is true (high is good)

High statistical power implies low probability of Type-II error

## α of a Statistical Test

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

# p-value of a Statistical Test

- p-value is compared to α to decide whether to accept H0
- p-value should be as small as possible (i.e. below α-threshold)
- Typical thresholds are: reject null hypothesis if p < 1% or p < 5%

Used to learn about differences in averages across two categories.

## Example:

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

## T-test

## **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. (H0:  $\mu$  = 30mm)

You run the t-test and if the p-value is less that 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. (H1:  $\mu$  != 30mm)

#### 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 onesample 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.

