

# Introduction to Bioinformatics and Biostatistics

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Unidad de  
Bioinformática y  
Bioestadística



**WODA**  
WEB-BASED OMICS DATA ANALYSIS

# Outline

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## 1 Bioinformatics

- Technologies
- Data Bases

## 2 Biostatistics

- Distributions
- Tests

# Outline

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## 1 Bioinformatics

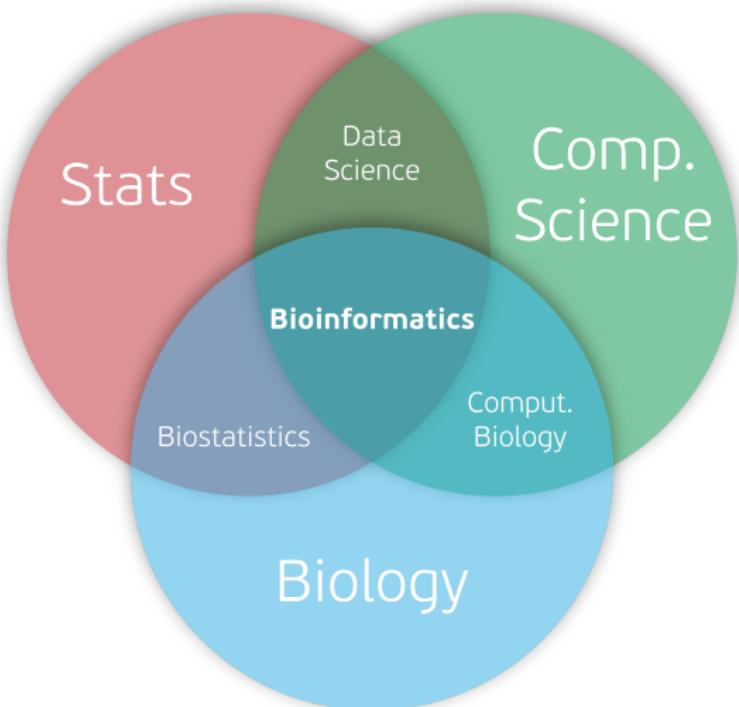
- Technologies
- Data Bases

## 2 Biostatistics

- Distributions
- Tests

# What is Bioinformatics?

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# What is Bioinformatics?

## Big Data

DNA contains 3.200M of bases

Each genome contains ~20.000 genes

Studies include up to 100.000 patients



## Structural Bioinformatics

Prediction of the structure of a protein

Creation of new drugs



## Bioinformatics Database Building

Management of massive biological resource data and development of databases



## Bioinformatics analysis

Sequencing techniques:

- Disease mechanisms
- Phylogenetics
- Population genetics



# What is Bioinformatics?

## Big Data

DNA contains 3.200M of bases  
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Studies include up to 100.000 patients



## Bioinformatics Database Building

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## Structural Bioinformatics

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## OMICS

### Bioinformatics analysis

Sequencing techniques:

- Disease mechanisms
- Phylogenetics
- Population genetics



# What is Bioinformatics?

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- Genomics
- Metabolomics
- Proteomics
- Transcriptomics

# Data bases

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What for?

- experiment data (raw / processed)
- variants
- pathways

# Outline

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## 1 Bioinformatics

- Technologies
- Data Bases

## 2 Biostatistics

- Distributions
- Tests

# Variables

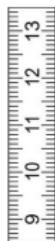
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|  | Human | Mouse | Plant |
|--|-------|-------|-------|
|  |       |       |       |
|  |       |       |       |
|  |       |       |       |
|  |       |       |       |
|  |       |       |       |

# Variables

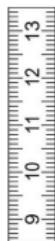
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|        | Human | Mouse | Plant |
|--------|-------|-------|-------|
| Height | 170cm | 25cm  | 10cm  |
|        |       |       |       |
|        |       |       |       |
|        |       |       |       |
|        |       |       |       |

# Variables

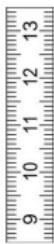
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|        | Human   | Mouse | Plant |
|--------|---------|-------|-------|
| Height | 170cm   | 25cm  | 10cm  |
| Weight | 68.000g | 150g  | 10g   |
|        |         |       |       |
|        |         |       |       |
|        |         |       |       |

# Variables

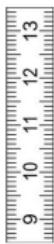
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|            | Human   | Mouse | Plant |
|------------|---------|-------|-------|
| Height     | 170cm   | 25cm  | 10cm  |
| Weight     | 68.000g | 150g  | 10g   |
| Color eyes | Brown   | Black | NA    |
|            |         |       |       |

# Variables

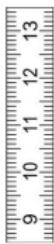
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|               | Human   | Mouse | Plant |
|---------------|---------|-------|-------|
| Height        | 170cm   | 25cm  | 10cm  |
| Weight        | 68.000g | 150g  | 10g   |
| Color eyes    | Brown   | Black | NA    |
| Color flowers | NA      | NA    | White |

# Variables

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|               | Human   | Mouse | Plant |
|---------------|---------|-------|-------|
| Height        | 170cm   | 25cm  | 10cm  |
| Weight        | 68.000g | 150g  | 10g   |
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NUMERICAL

# Variables

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|               | Human   | Mouse | Plant |             |
|---------------|---------|-------|-------|-------------|
| Height        | 170cm   | 25cm  | 10cm  | NUMERICAL   |
| Weight        | 68.000g | 150g  | 10g   |             |
| Color eyes    | Brown   | Black | NA    | CATEGORICAL |
| Color flowers | NA      | NA    | White |             |

# Population

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POPULATION

# Population

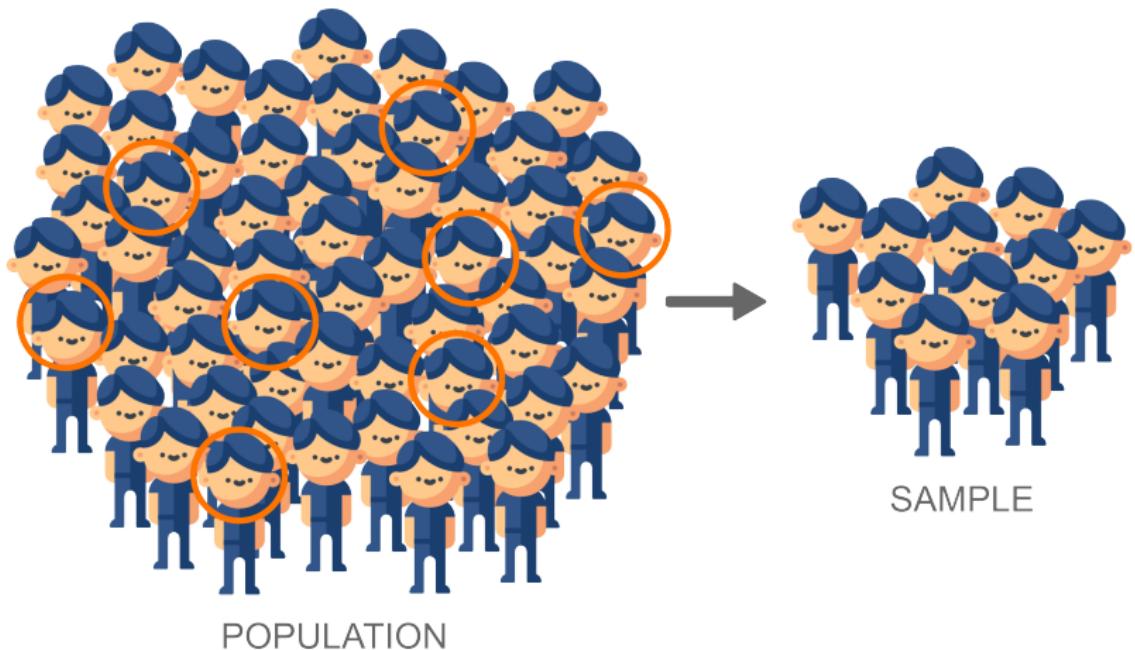
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POPULATION

# Population

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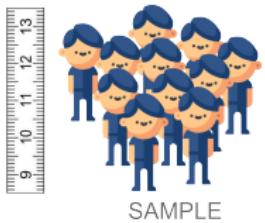
# Numerical variable

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# Numerical variable

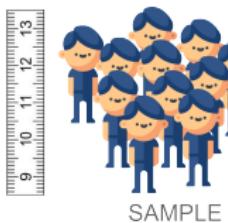
---



|         | Height |
|---------|--------|
| Human 1 | 1'70   |
| Human 2 | 1'53   |
| Human 3 | 2'01   |
| Human 4 | 1'82   |
| Human 5 | 1'65   |
| Human 6 | 1'73   |
| Human 7 | 1'91   |
| Human 8 | 1.81   |

# Numerical variable

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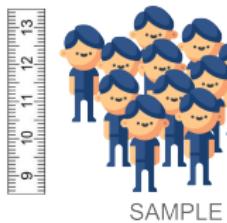
SAMPLE

| Height  |      |
|---------|------|
| Human 1 | 1'70 |
| Human 2 | 1'53 |
| Human 3 | 2'01 |
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**SAMPLING  
DISTRIBUTION**

# Numerical variable

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|         | Height |
|---------|--------|
| Human 1 | 1'70   |
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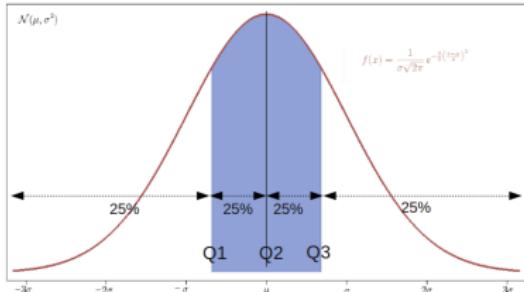
SAMPLING  
DISTRIBUTION

- mean
- median
- mode
- variance

# Quantiles, Quartiles and Percentiles

## Quantiles

Cut points dividing the observations in a sample in intervals of equal dimension.



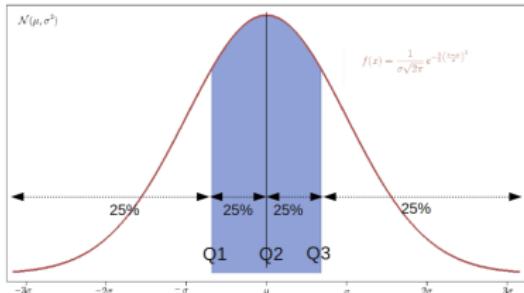
# Quantiles, Quartiles and Percentiles

## Quantiles

Cut points dividing the observations in a sample in intervals of equal dimension.

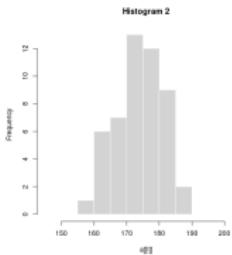
### Special cases

- 2-quantile: median
- 4-quantile: quartiles
- 100-quantile: percentiles

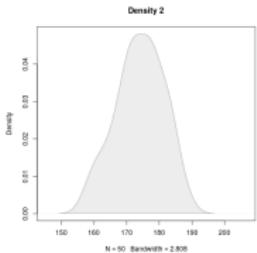


# Representing Numerical variables

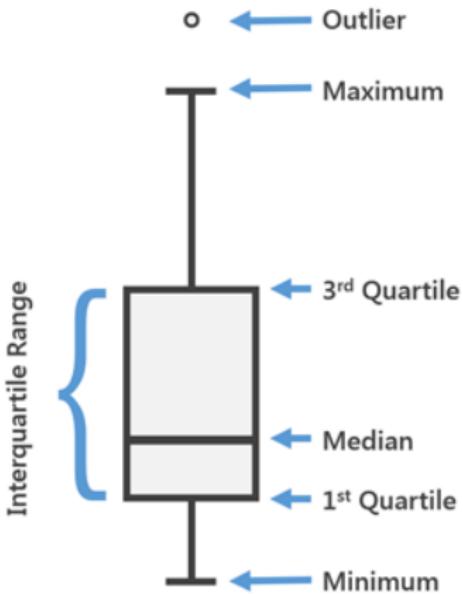
## Histogram



## Density



## Boxplot

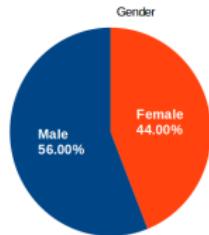


# Representing categorical variables

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## Pie Chart

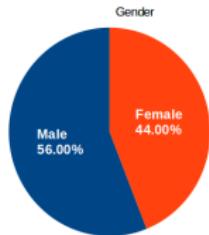
- One categorical variable



# Representing categorical variables

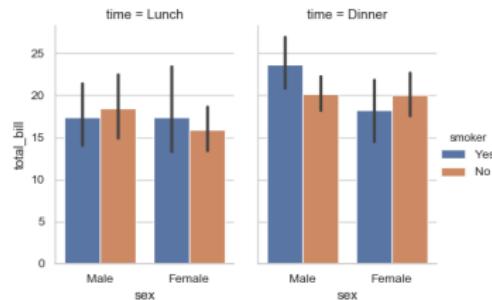
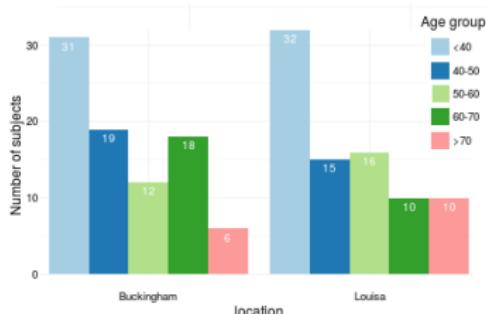
## Pie Chart

- One categorical variable



## Bar plot

- Multiple categorical variables
- Relation categorical and numerical variables



# Sampling distribution

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SAMPLE



POPULATION

# Sampling distribution

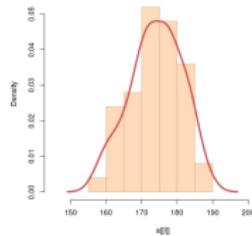


SAMPLE

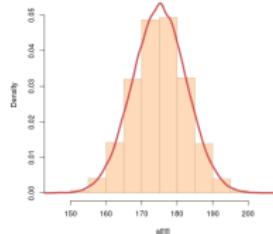


POPULATION

Histogram and Density 2



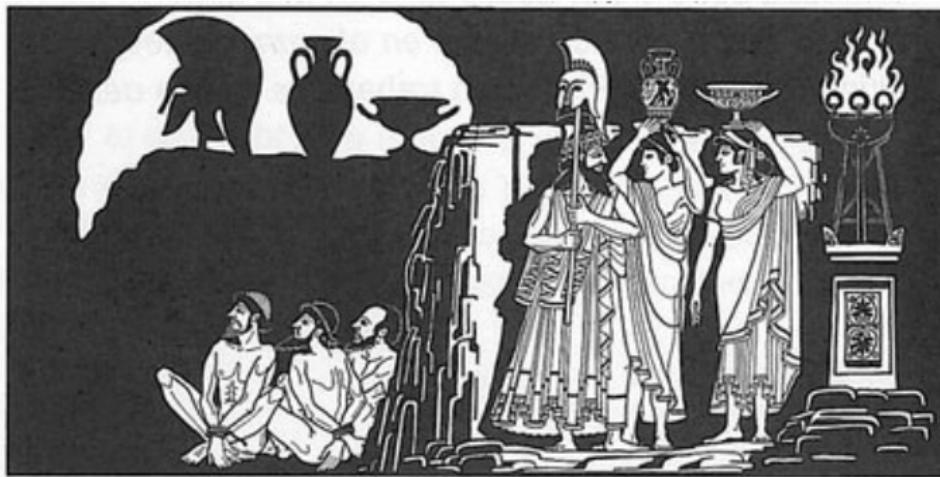
Histogram and Density of Population



# Sample / Population

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## Plato's Cave Myth

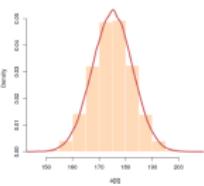
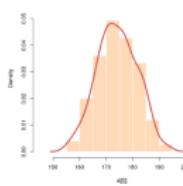
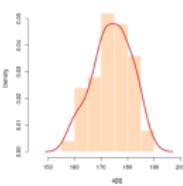
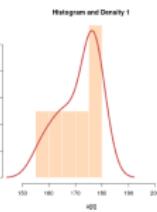


# Sample Size

Shadow

N

Histogram

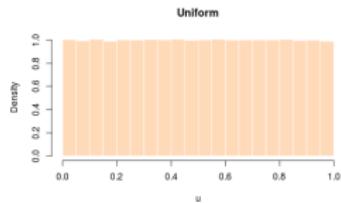


# Distributions

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## Uniform

- All values equal probability
- Parameters: min, max

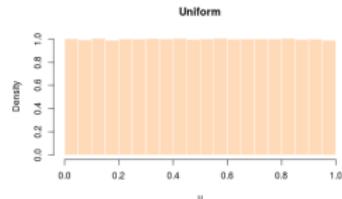


# Distributions

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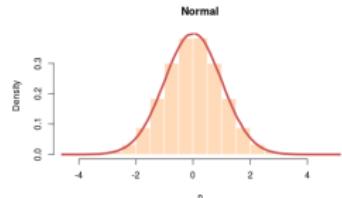
## Uniform

- All values equal probability
- Parameters: min, max



## Normal

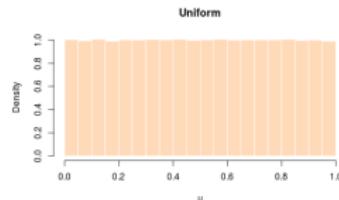
- Gauss Bell
- Parameters:  $\mu, \sigma$



# Distributions

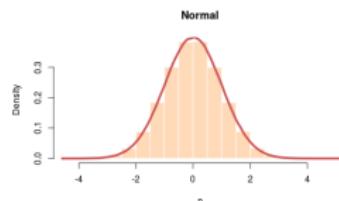
## Uniform

- All values equal probability
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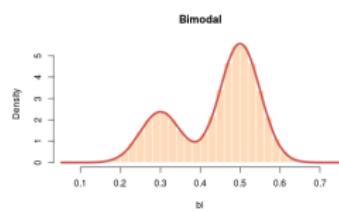
## Normal

- Gauss Bell
- Parameters:  $\mu, \sigma$

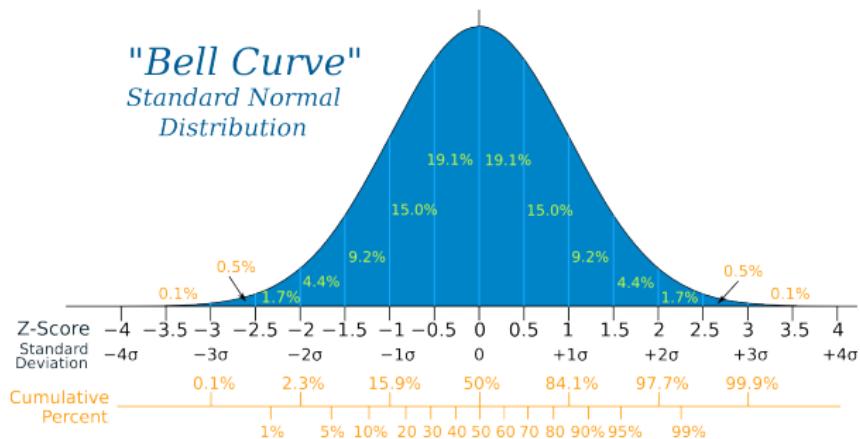
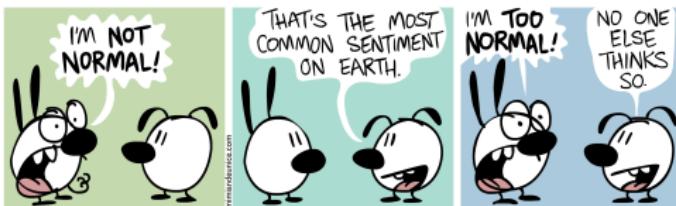


## Bimodal

- Two different distributions combined
- Parameters:  $(\mu_1, \sigma_1), (\mu_2, \sigma_2)$



# Normal distribution



# Inference

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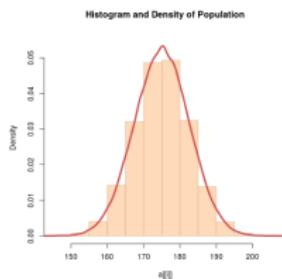
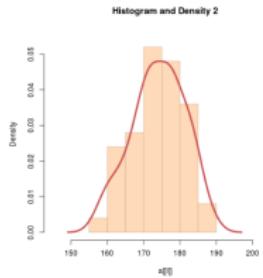
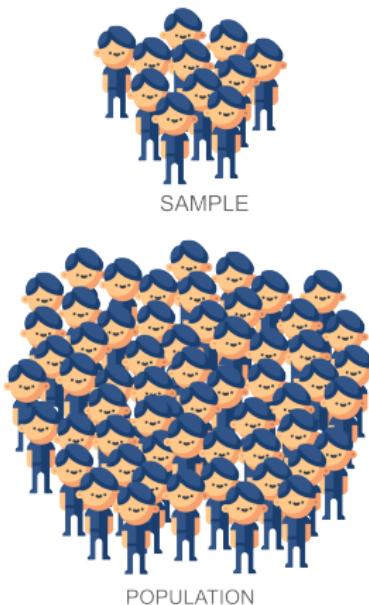
## Inference

Conclude something about a parameter in the population from the data in the sample

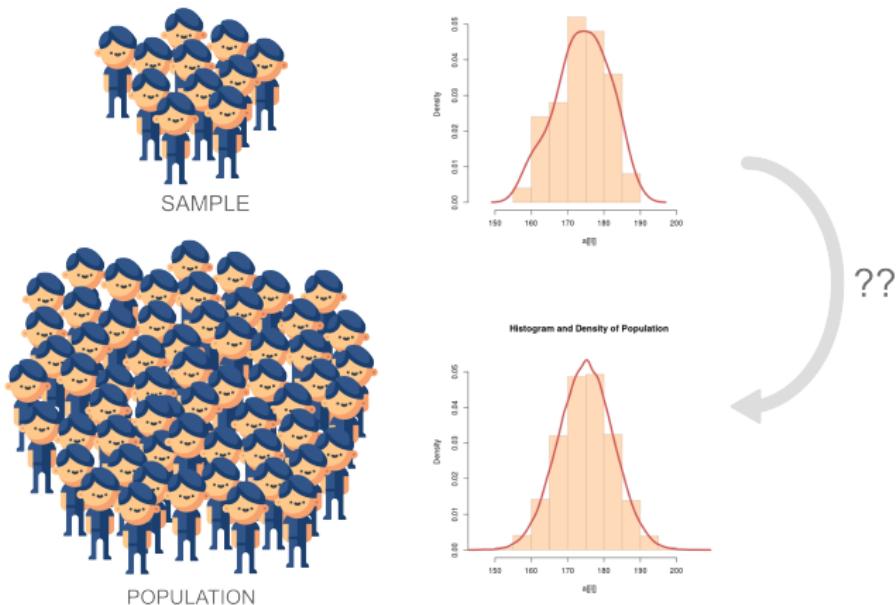
- Confidence intervals
- Hypothesis tests
- Specific tests

# Confidence intervals

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# Confidence intervals

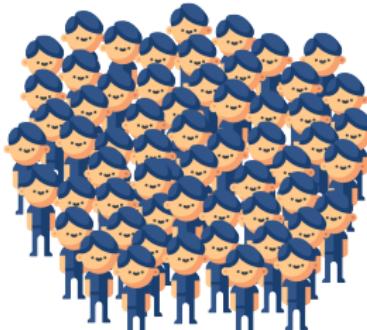


# Confidence intervals

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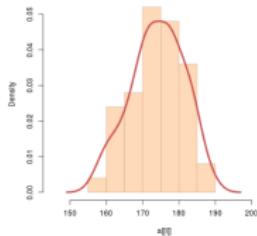


SAMPLE

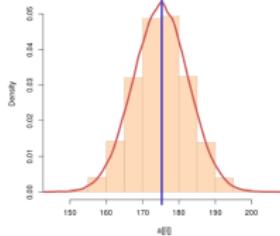


POPULATION

Histogram and Density 2

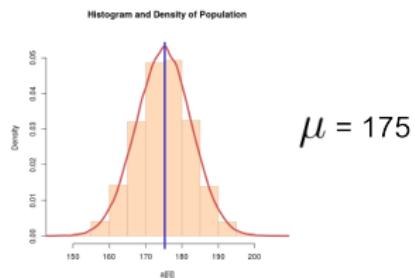
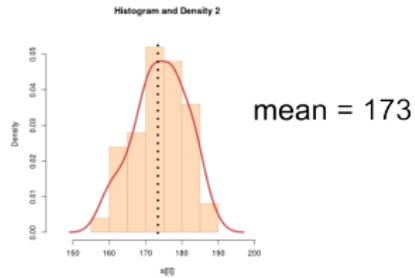
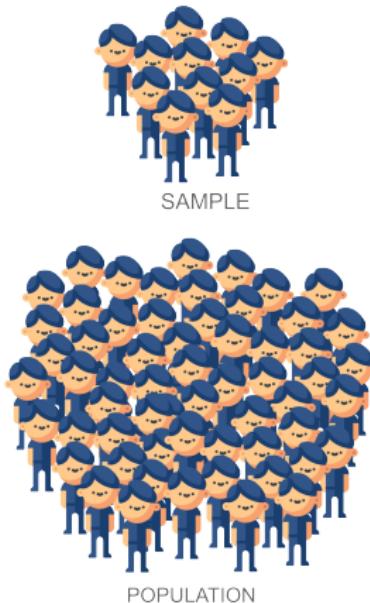


Histogram and Density of Population



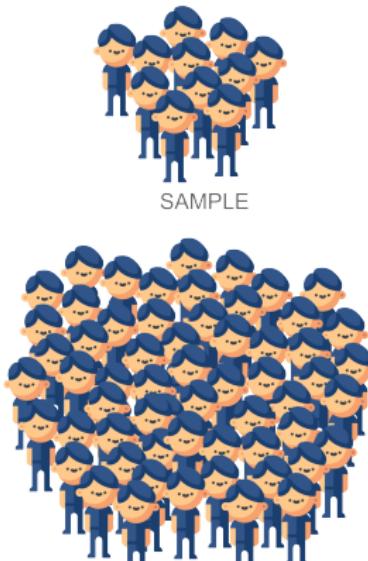
$$\mu = 175$$

# Confidence intervals



# Confidence intervals

Population

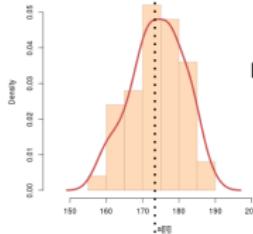


Sample



Histogram and Density 2

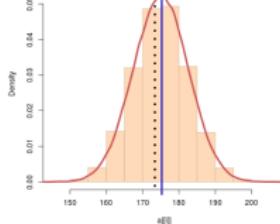
Density



mean = 173

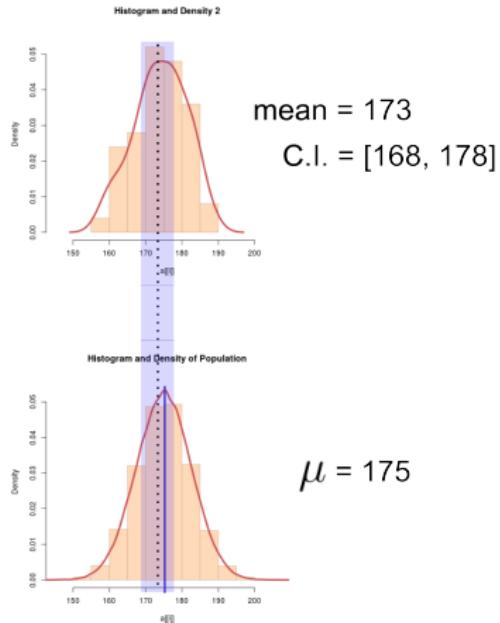
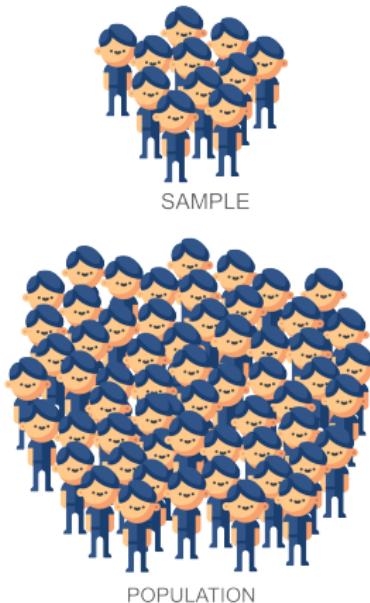
Histogram and Density of Population

Density



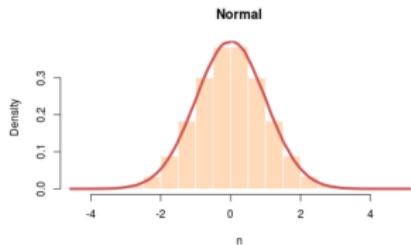
$\mu = 175$

# Confidence intervals



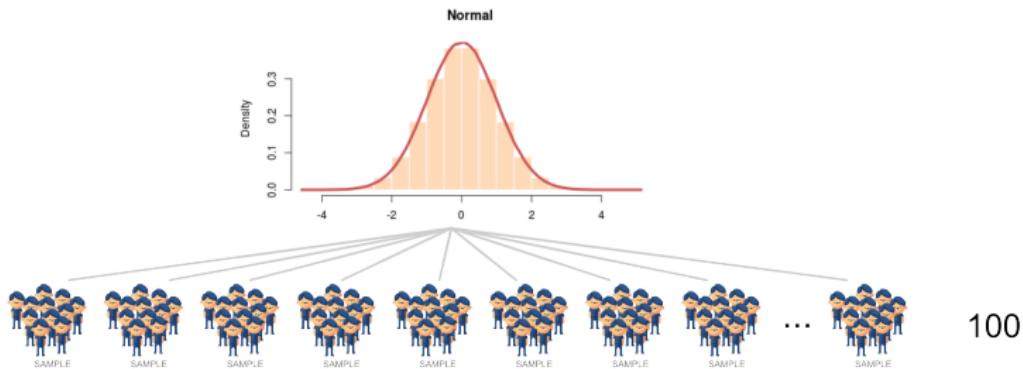
# Confidence intervals

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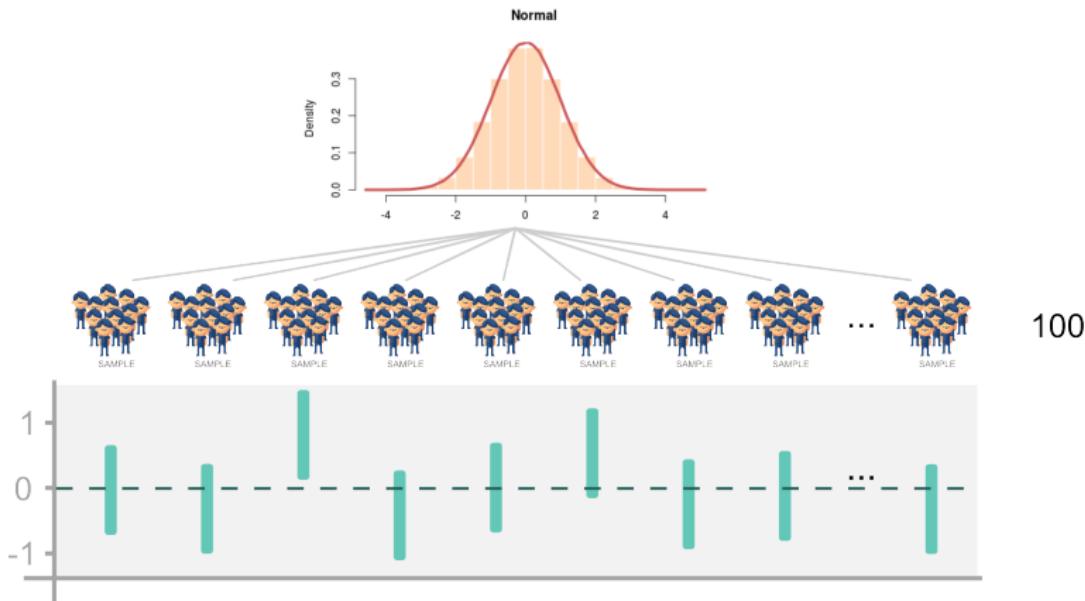


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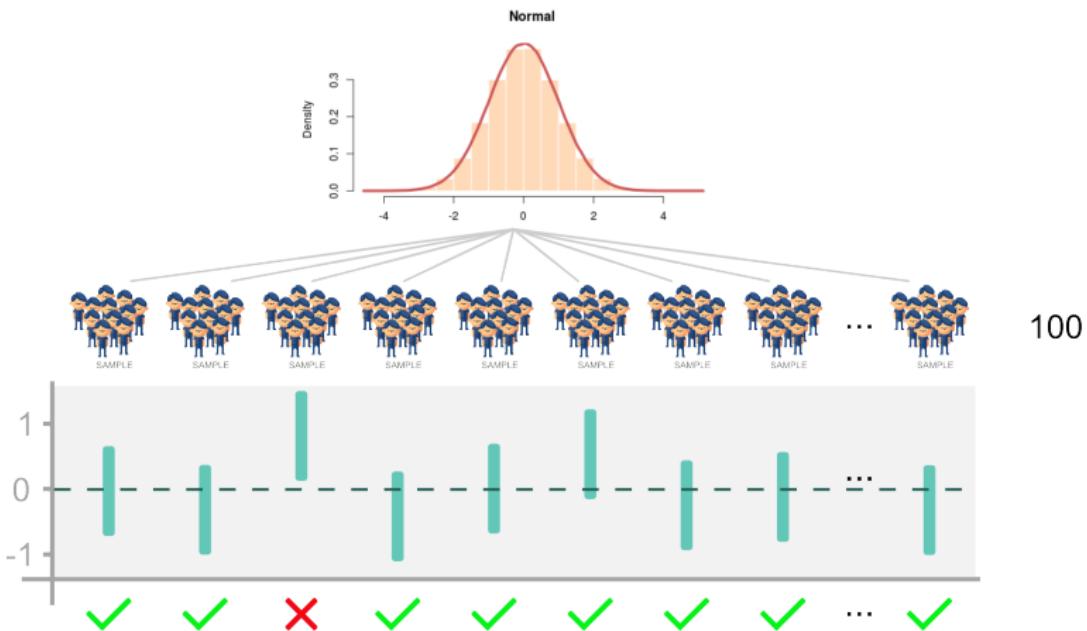
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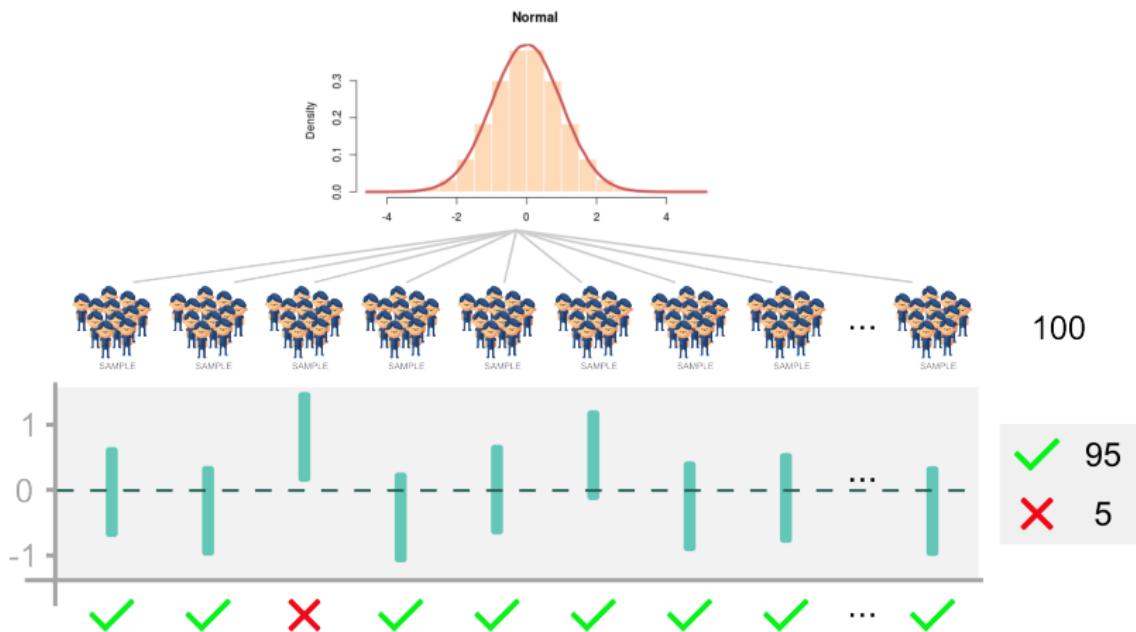
## Confidence intervals



# Confidence intervals



# Confidence intervals



# Hypothesis tests

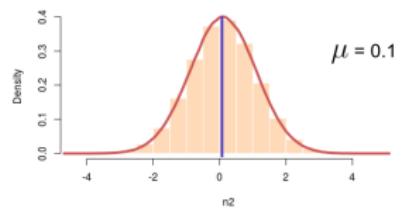
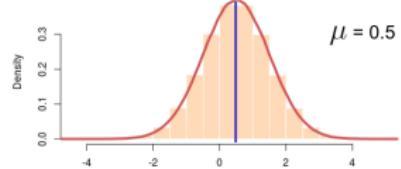
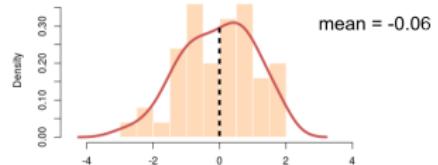
- Null hypothesis:

$$H_0 : \mu = 0.5$$

- Alternative hypothesis:

$$H_A : \mu \neq 0.5$$

- Compute confidence interval  $I$ .
- If  $0.5 \notin I$ , reject  $H_0$ .
- If  $0.5 \in I$ ,  $H_0$  is not rejected.



# Hypothesis tests

## t-test

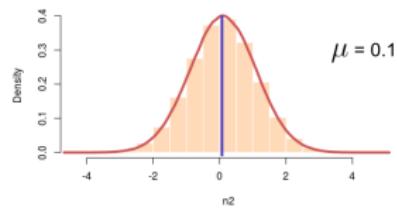
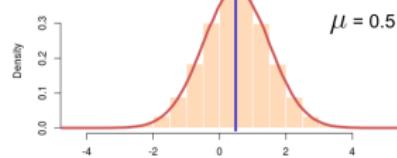
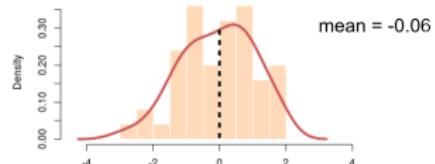
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# Hypothesis tests

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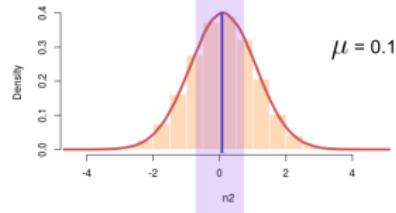
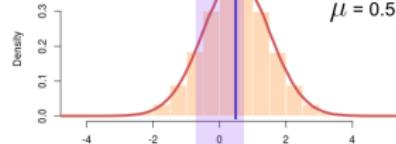
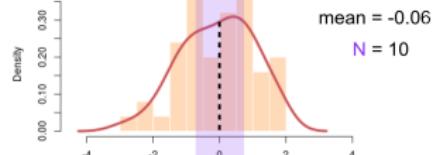
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# Hypothesis tests

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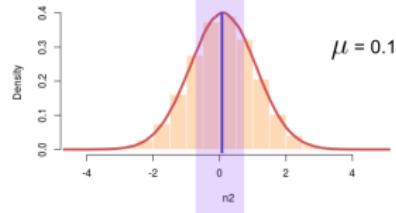
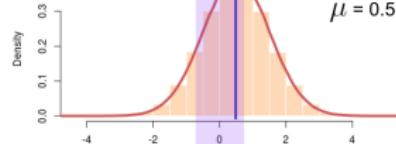
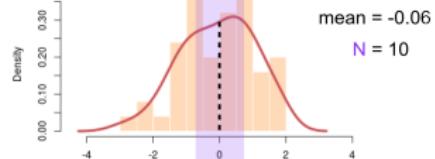
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- Compute confidence interval  $I$ .
- If  $0.5 \notin I$ , reject  $H_0$ .
- If  $0.5 \in I$ ,  $H_0$  is not rejected.



# Hypothesis tests

## t-test

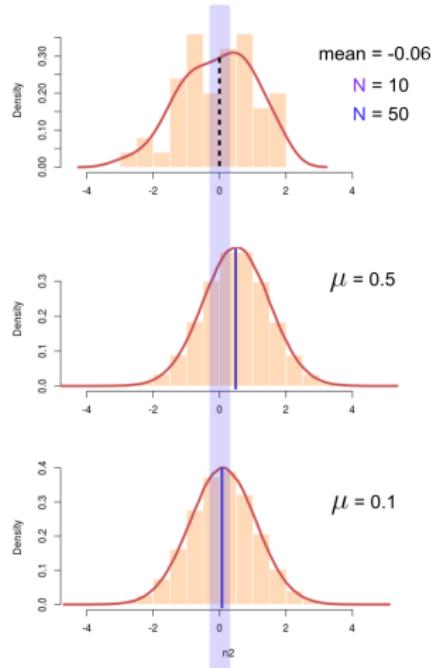
- Null hypothesis:

$$H_0 : \mu = 0.5$$

- Alternative hypothesis:

$$H_A : \mu \neq 0.5$$

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# Mean comparison

---

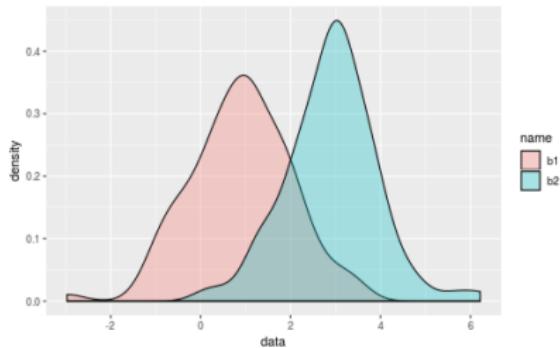
- Null hypothesis:

$$H_0 : \mu_1 = \mu_2$$

- Alternative hypothesis:

$$H_A : \mu_1 \neq \mu_2$$

- t-test, Wilcoxon
- Paired samples?



# Mean comparison

---

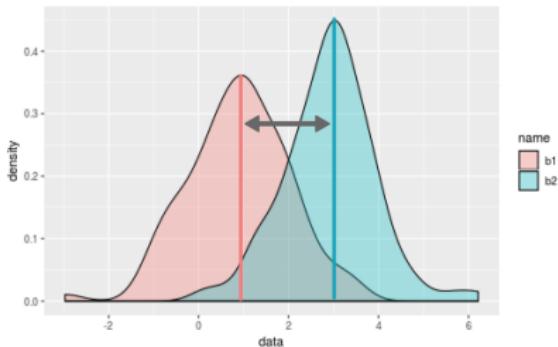
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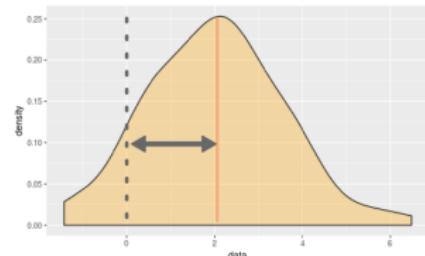
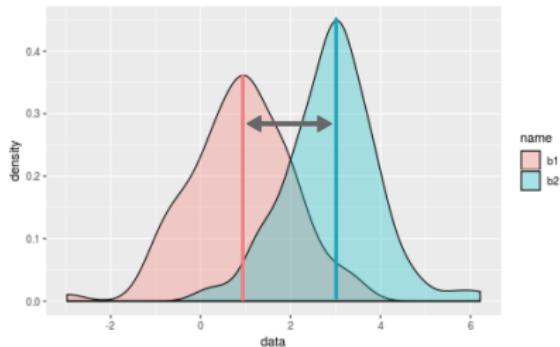
- Null hypothesis:

$$H_0 : \mu_1 - \mu_2 = 0$$

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- Paired samples?



# Mean comparison

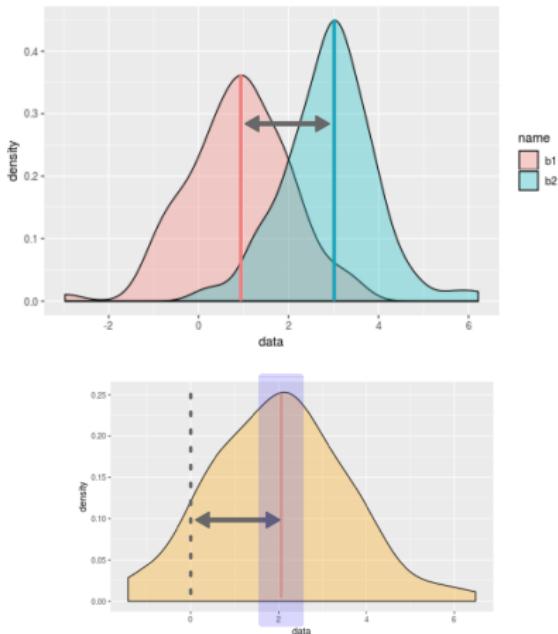
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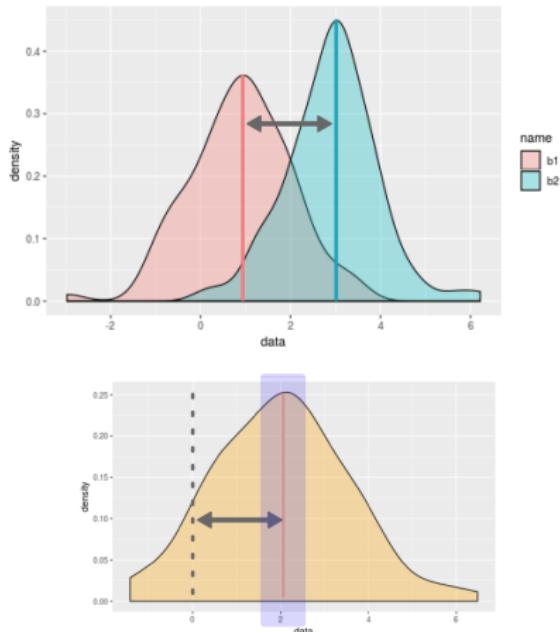
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# Fisher Test

Contingency table

Matrix that displays the frequency distribution of the variables

|                | Infected | Not infected |     |
|----------------|----------|--------------|-----|
| Inoculated     | 3        | 276          | 279 |
| Not inoculated | 66       | 473          | 539 |
|                | 69       | 749          | 818 |

Cholera Inoculation Study, 1894-96

- $H_0$  : Proportions are the same
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Cholera Inoculation Study, 1894-96

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The end

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Enjoy the course!!