Why are data collected?

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How to do it in a proper way?

Syllabus

Introduction & Descriptive Statistics	*chapter 6*
Introduction to Probability	*chapter 1*
Random Variables	*chapter 2*
Discrete and Continuous Probability Distributions	*chapters 3,4*
The Normal Probability Distribution	*chapter 5*
Sampling Distributions, Random Sample	*chapter 7*
Inferences on a Population Mean	*chapter 8*
Comparing Two Population Means	*chapter 9*
Simple Linear Regression and Correlation	*chapter 12*
Inferences on a Population Proportion	*chapter 10*
The Analysis of Variance	*chapter 11*

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- **Probability** - theoretical background for a random mechanism;
  (describes how the mechanism works - but the principle is unknown)
- **Statistics** - uses random outcomes to draw conclusions;
  (using statistics we can very precisely describe the mechanism behind)

Statistics in Real Life...

- In probability, we could have a precise description of the random mechanism behind which would be accurate, but it is unknown!
- In statistics, we have data (measurements) that are quite often not precise, but the final conclusions drawn from such data are very accurate!

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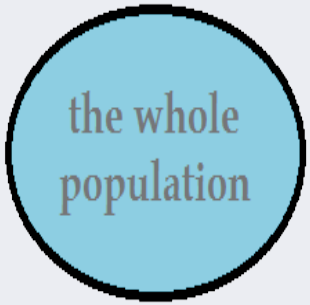
- "**I only believe in statistics that I doctored myself.**"
  Winston S. Churchill (1874 – 1965)

Population vs. Sample



Population vs. Sample

Probability Theory
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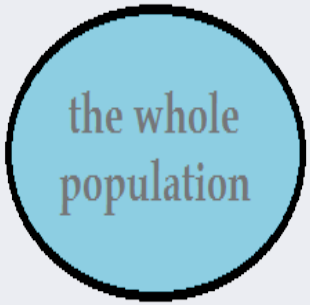

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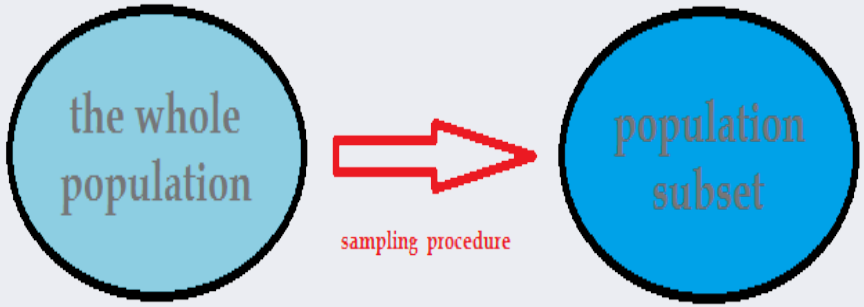

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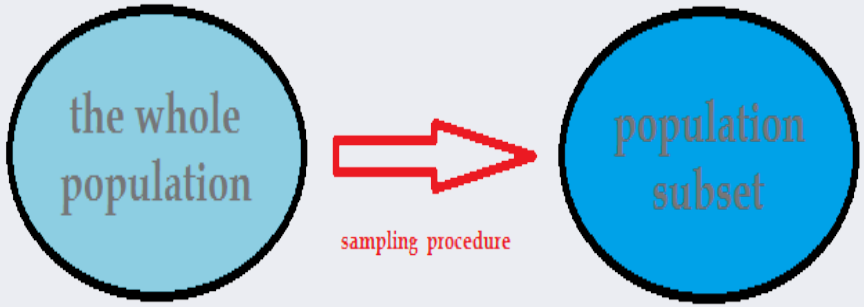
Probability Theory	Finite Sample
Random Distribution	Empirical Distribution



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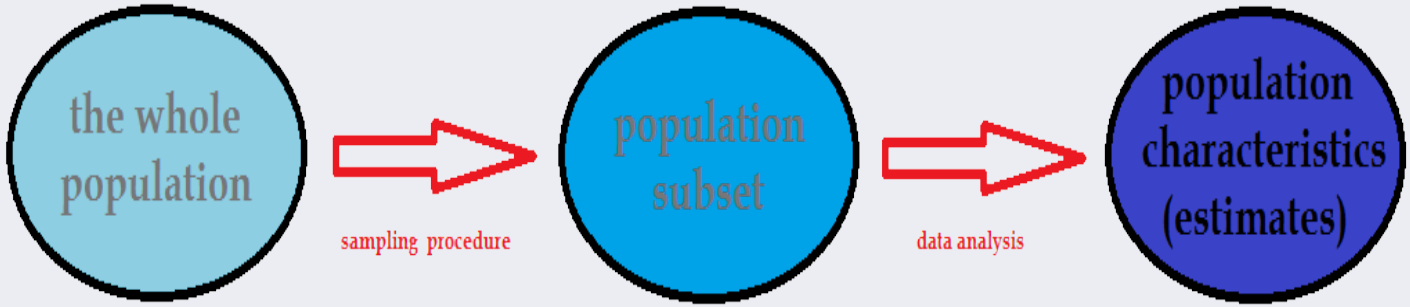
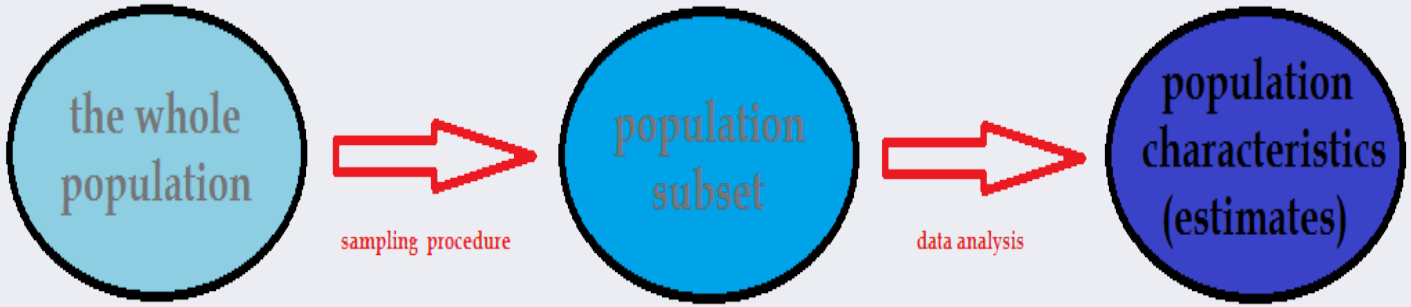


Population vs. Sample

Probability Theory	Finite Sample	Sample Statistics
Random Distribution	Empirical Distribution	



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Probability Theory	Finite Sample	Sample Statistics
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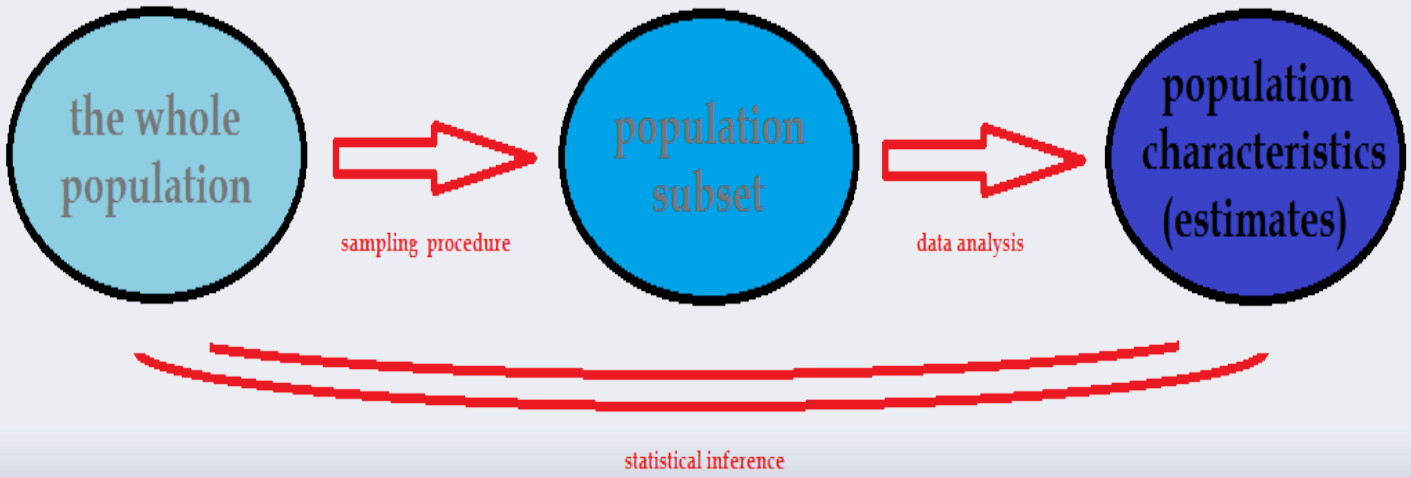

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      What kind of transportation do you use to get to work?
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      How many people visit this museum a day?
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  - Real values
    - any real value is possible...
      length, weight, height, temperature, etc.

Data exploration

- What is the nature of data?
- What are the limitations of the experiment behind?

- What is the main question of interest?
- Is it possible to use data available to answer it?

- Is it important to visualize the data?
- How can one get an insight in the data?

Binary Data

- the simplest data type...
- different coding possible...
  - logical: TRUE | FALSE; 1|0; YES|NO;
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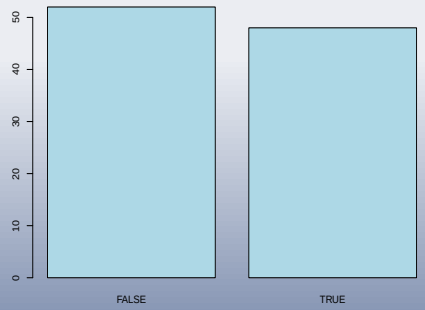

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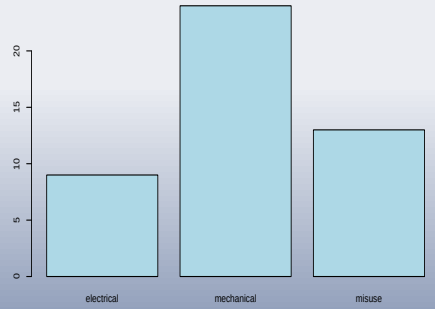

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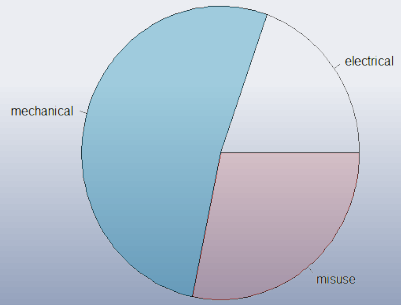

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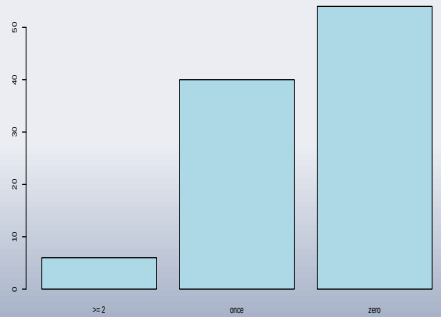

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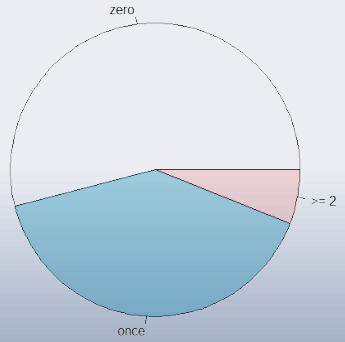

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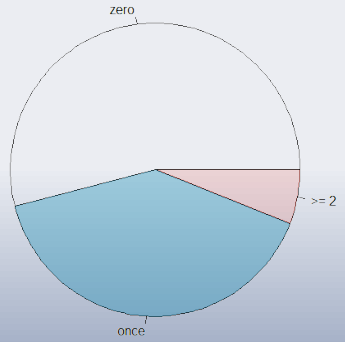

- What is the main difference between nominal and ordinal categories?

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- **Integer values - counts...**
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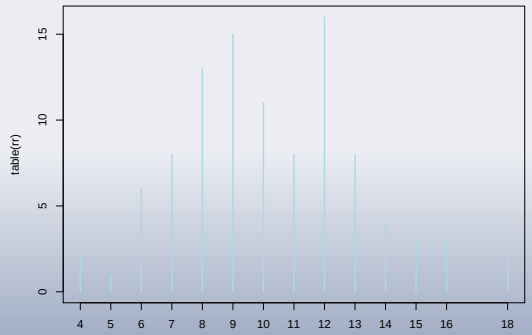

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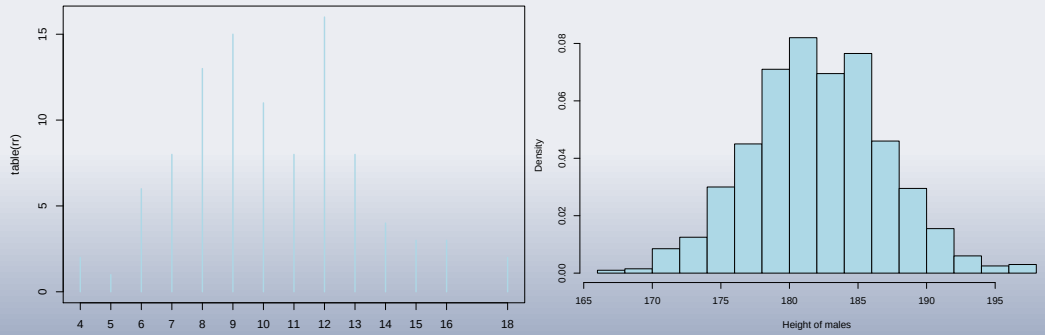

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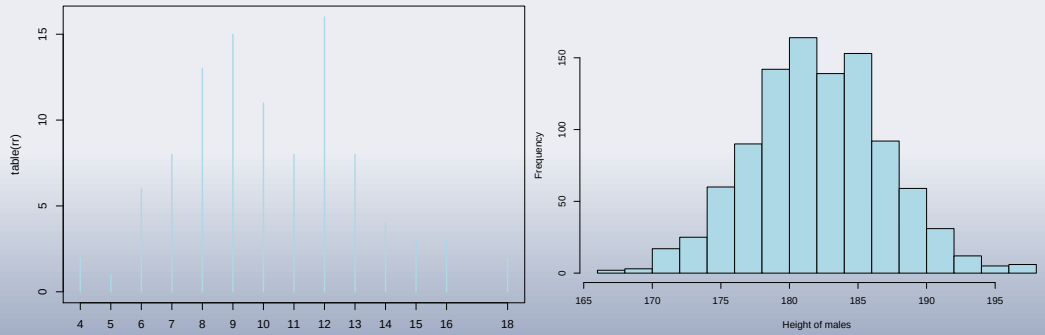

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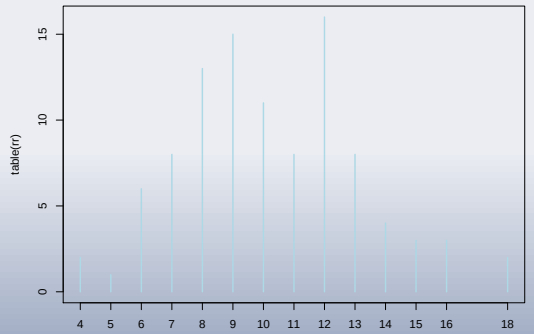

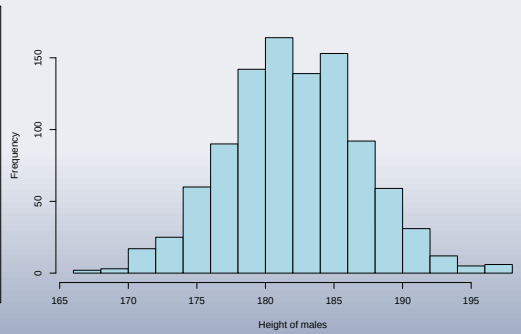

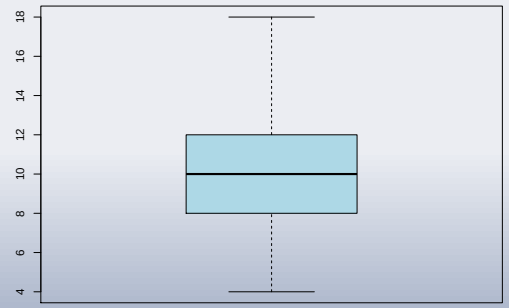

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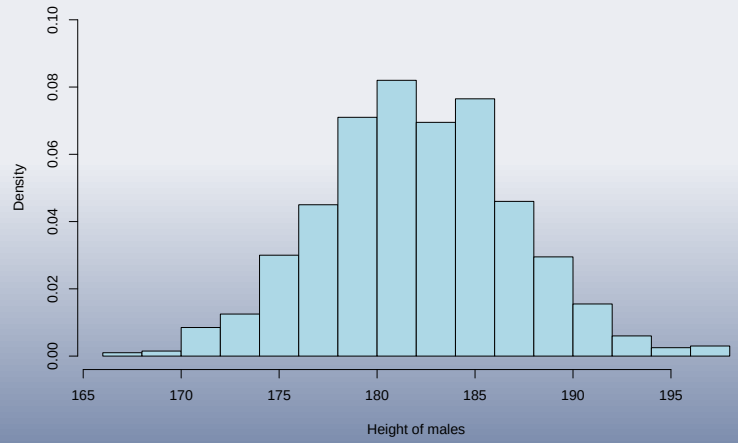

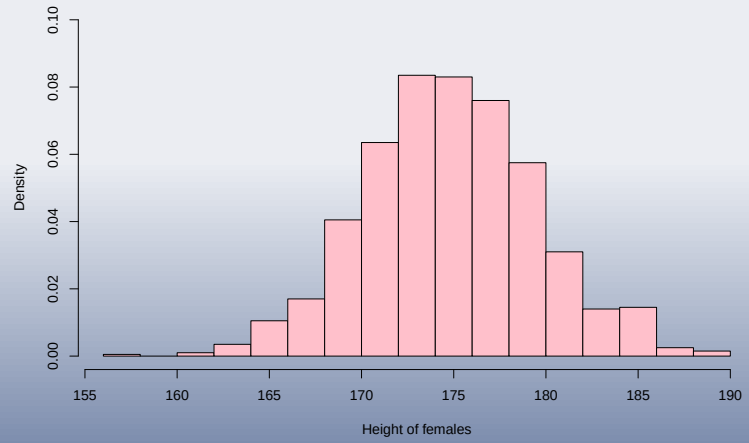

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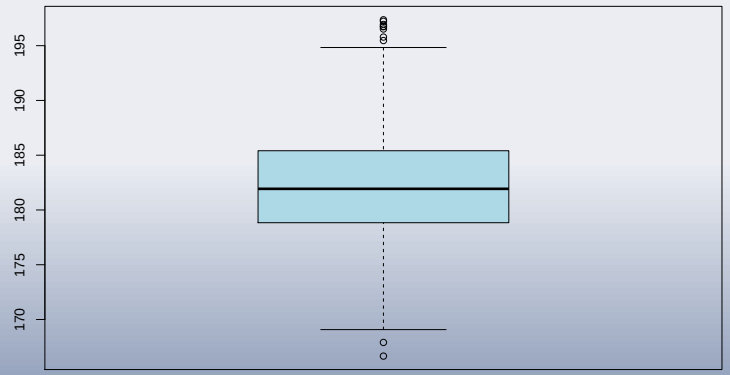

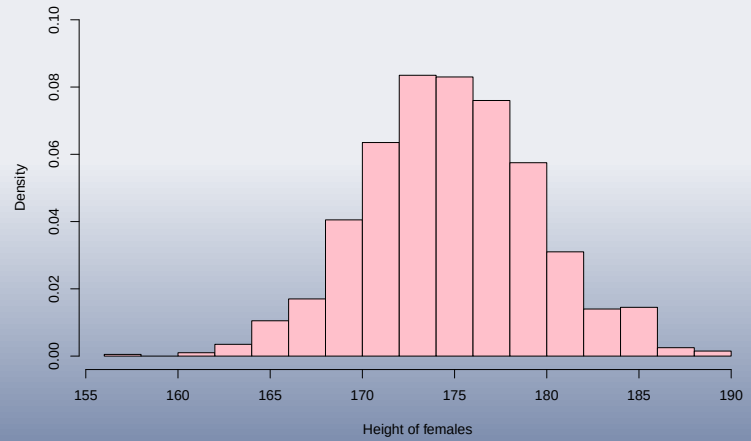

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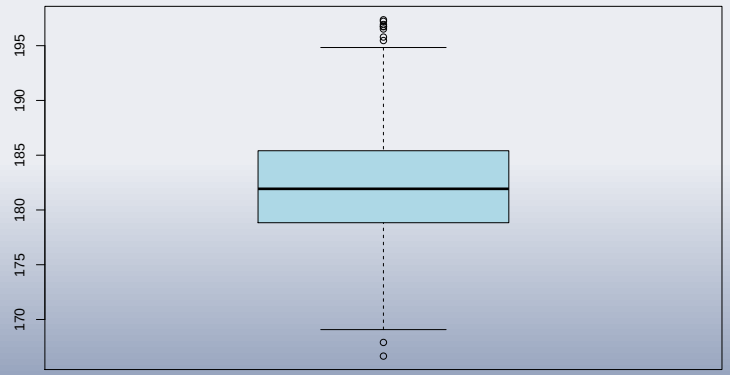

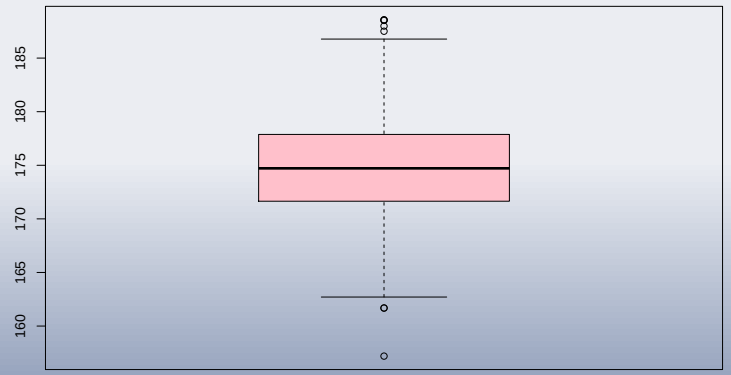

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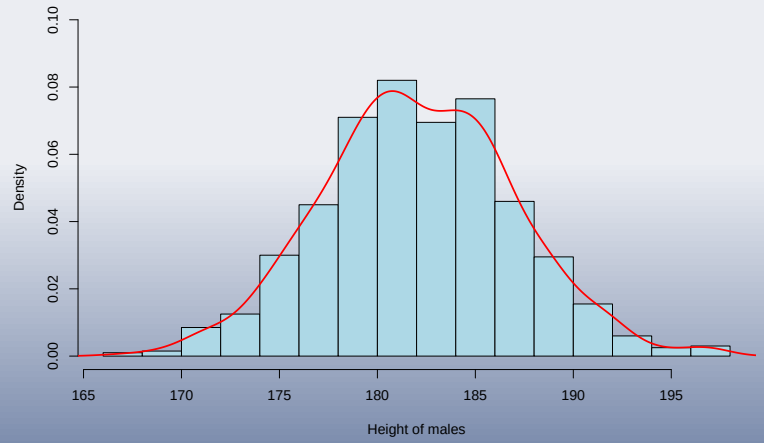

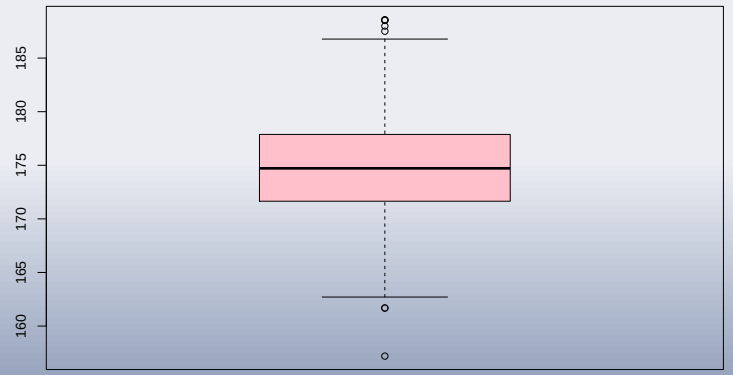

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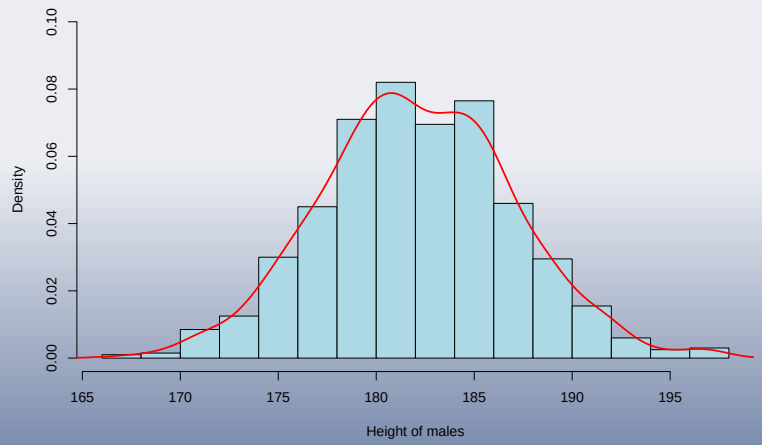

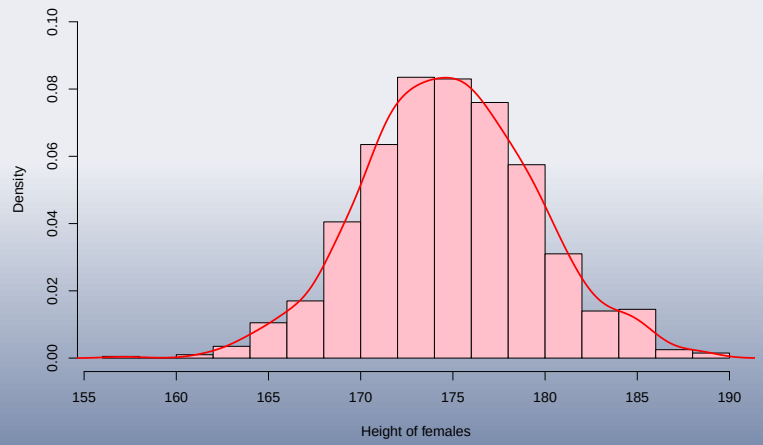

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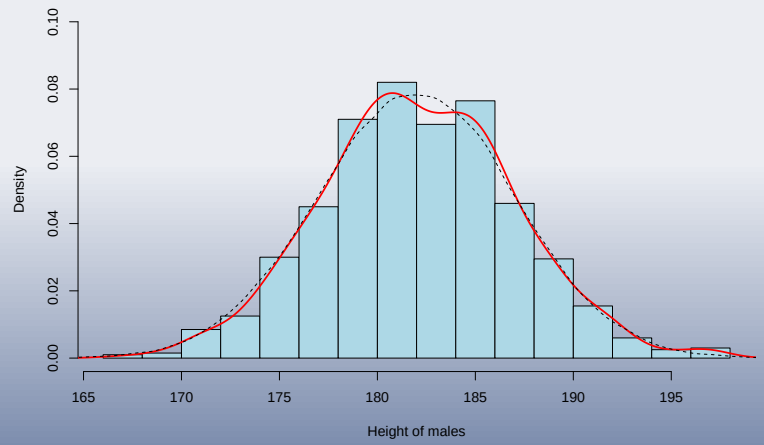

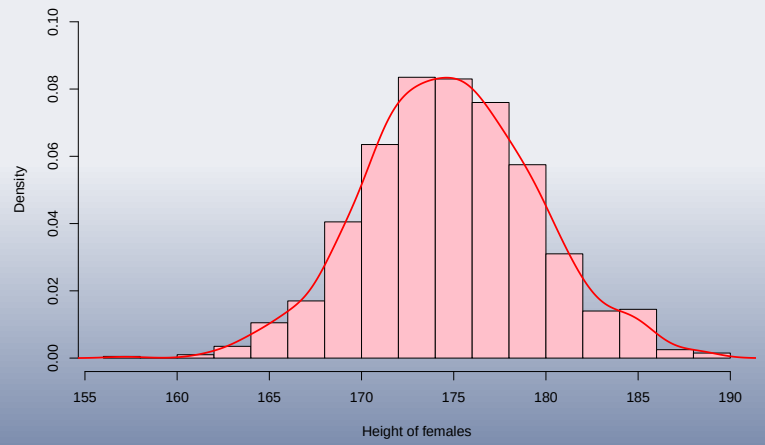

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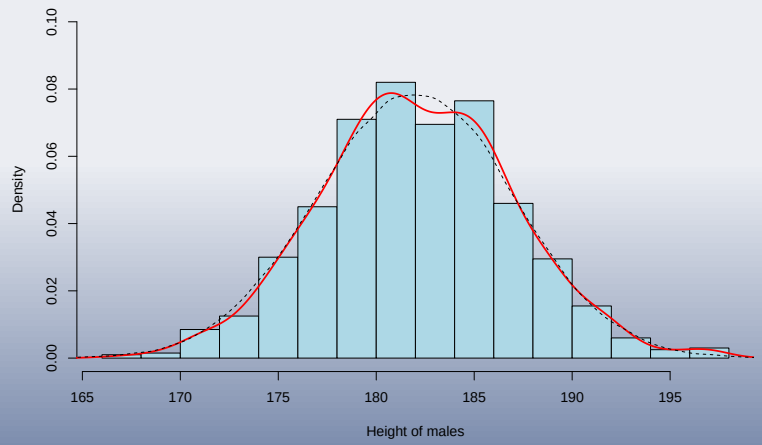
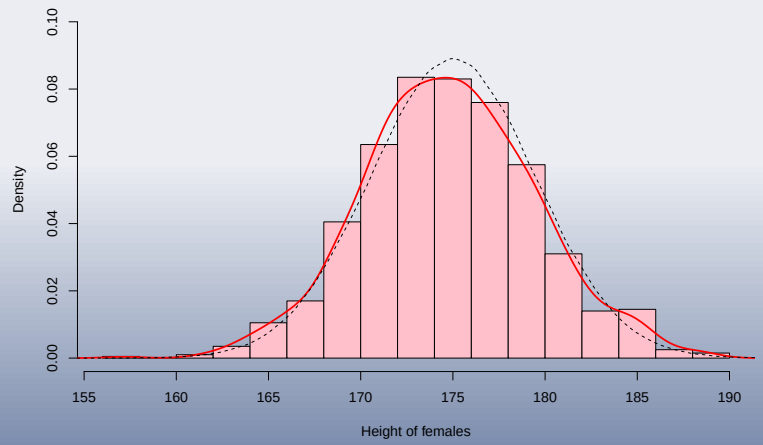
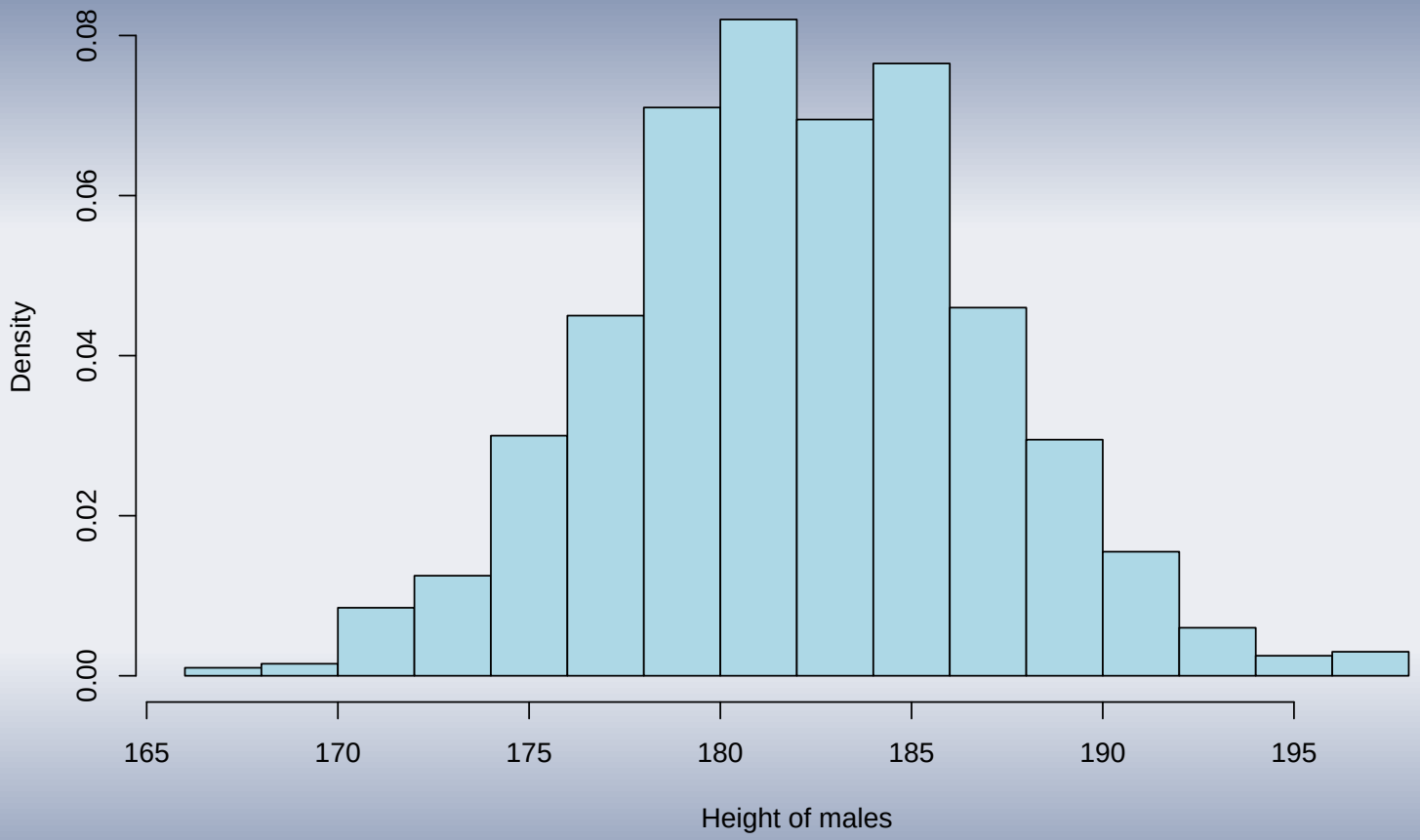
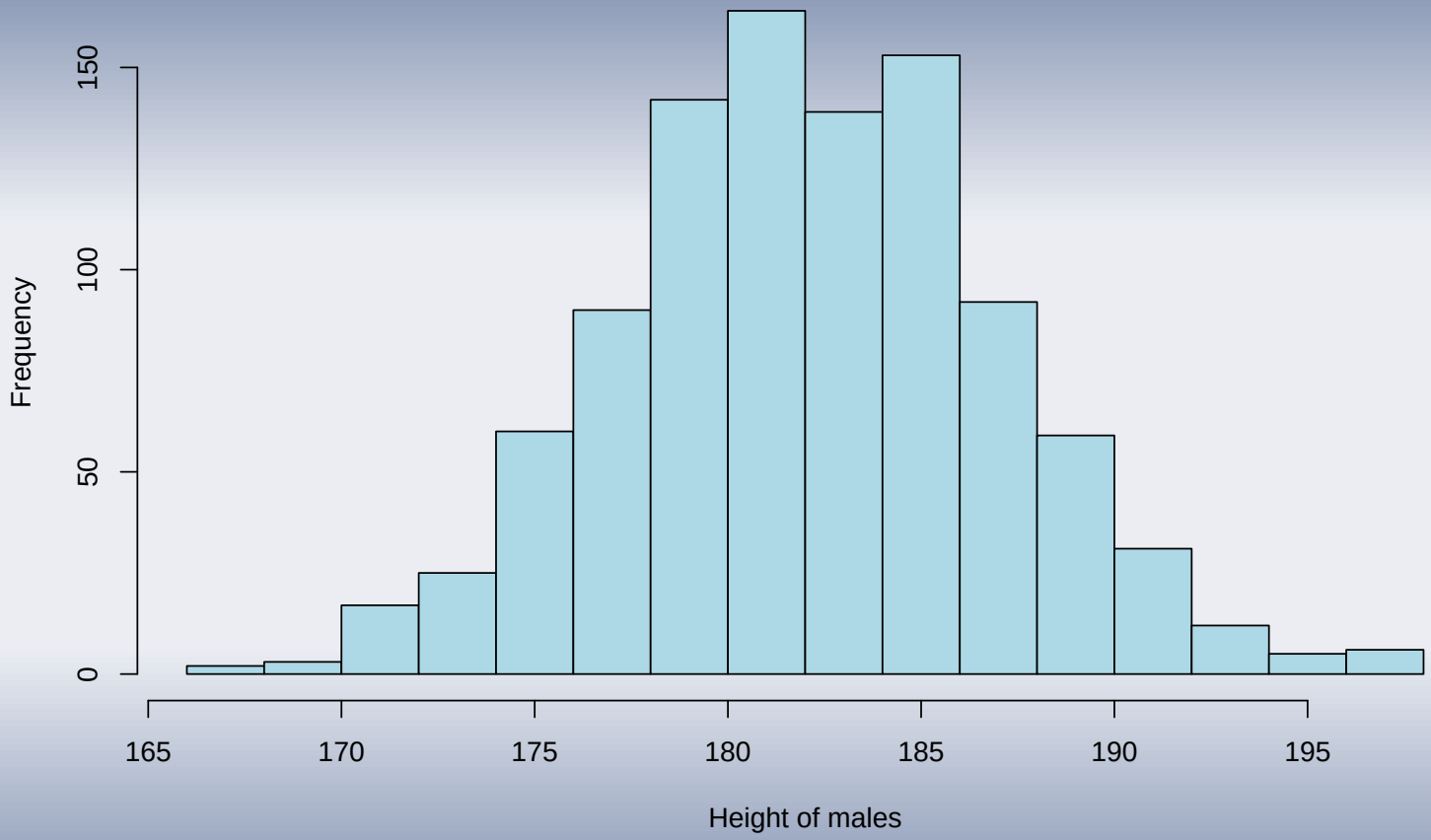




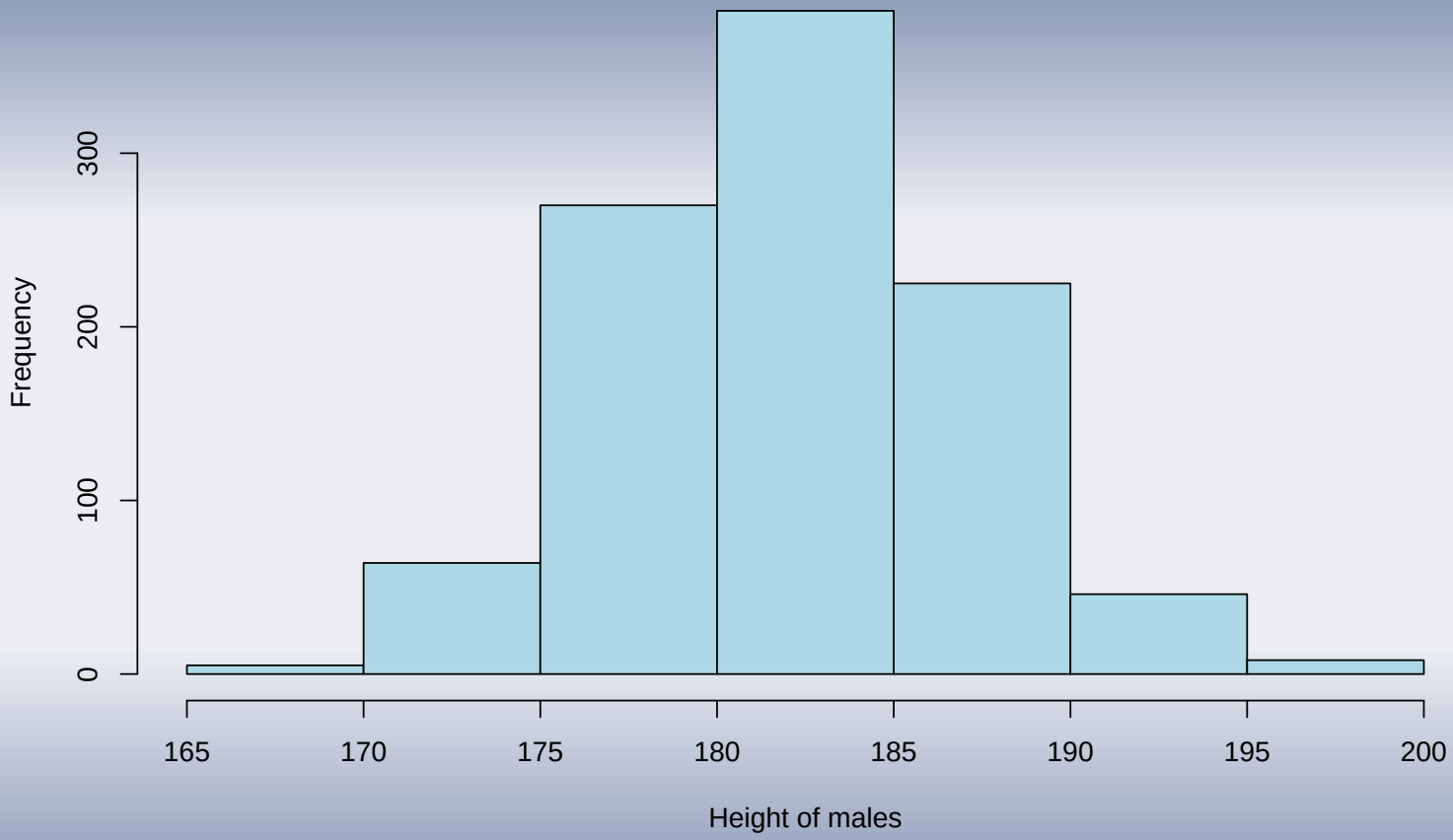
Histogram...


Density
0.00
0.02
0.04
0.06
0.08
165
170
175
180
185
190
195
Height of males

Histogram...


Frequency
0
50
100
150
165
170
175
180
185
190
195
Height of males

Histogram...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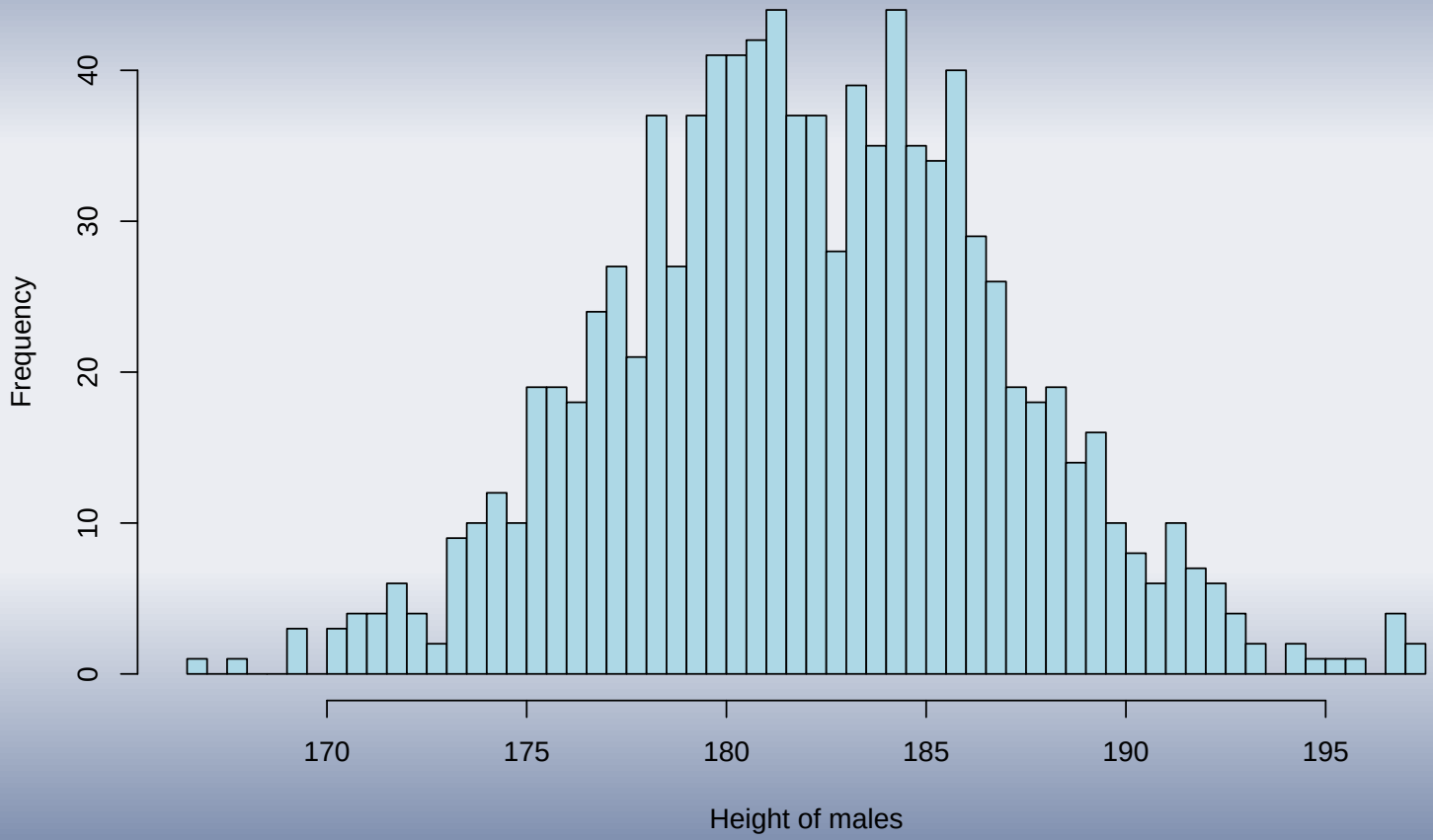

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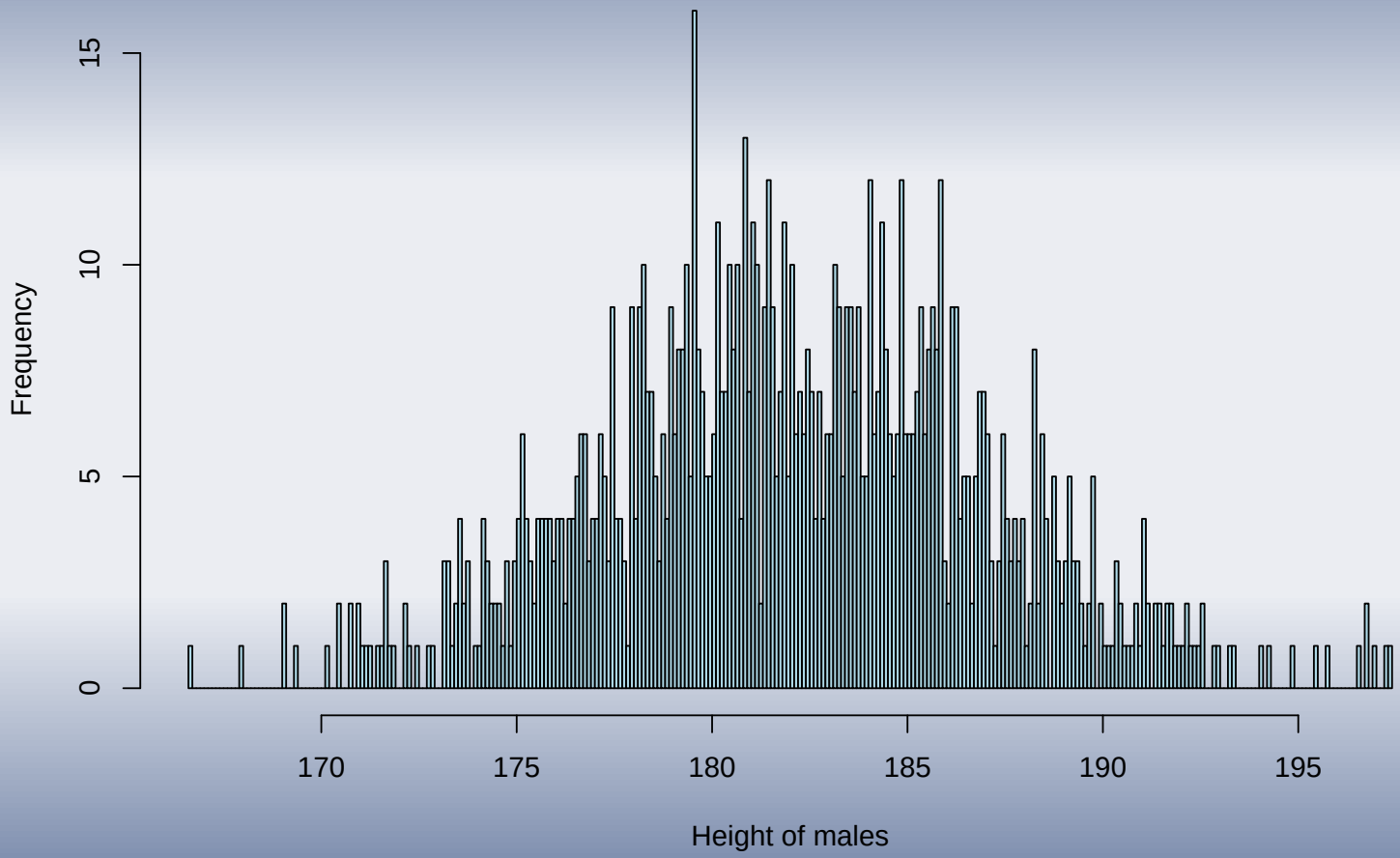
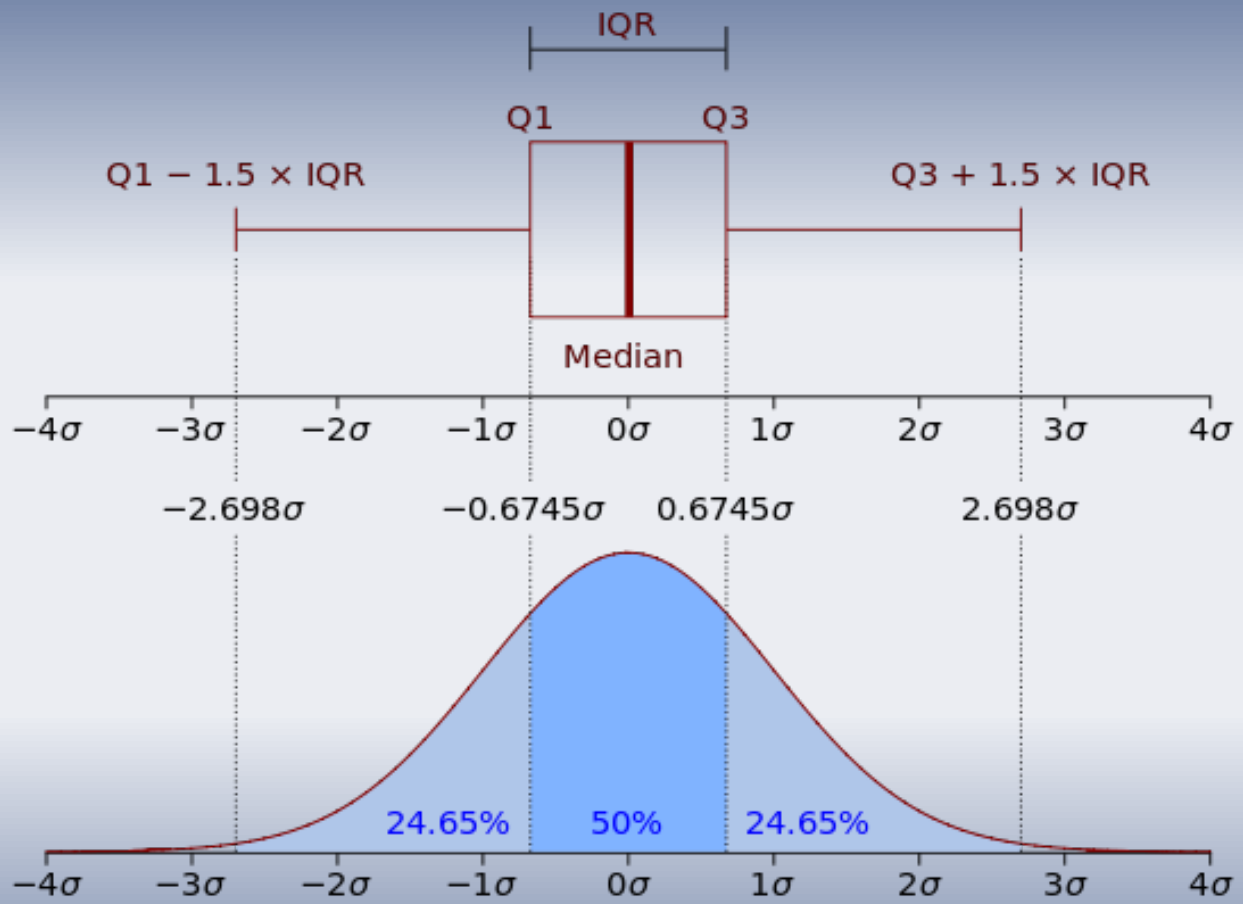


Boxplot figure...



Some nice properties

What can be directly observed from histogram (boxplot)?

- symmetric/non-symmetric data distribution;
- unimodal or multimodal data distribution;
- skewness of data distribution;
- indications of outlying observations;
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It is not so much important now when we only focus on data exploration part however, it will become really crucial when considering more sophisticated statistical modeling approaches.

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- How reliable such data samples are?
- Could we expect more reliability and confidence if more data is available?

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- The more data we obtain the more we have to pay for...
- How to find a reasonable balance?

From counts to ordinal categories

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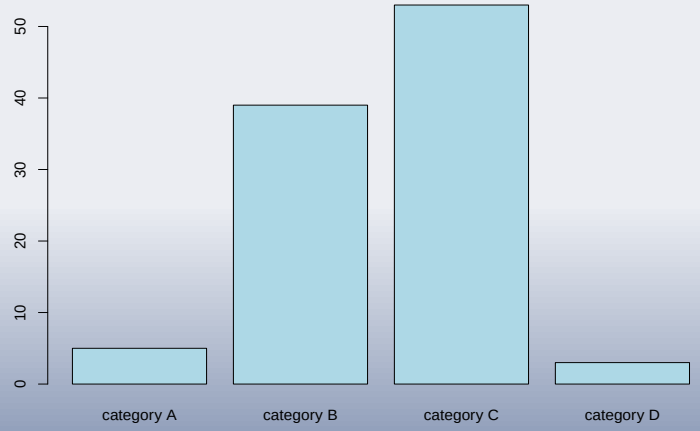

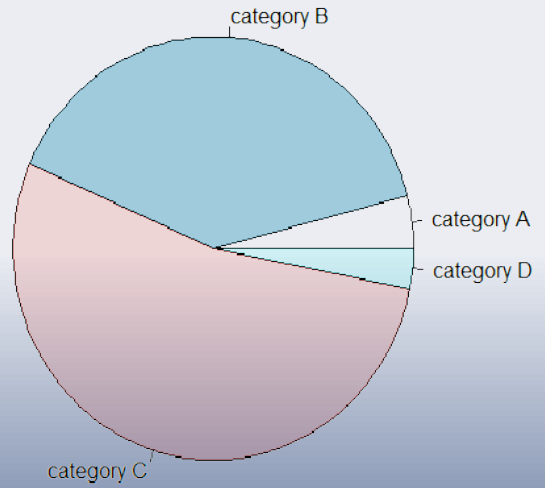

Higher dimensional data

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- more dimensional data $\Rightarrow$ it gets even difficult to plot;
- multivariate statistical methods were proposed to be used instead;

Titanic survivals

```
      Sex
Class  Male Female
  1st     0      0
  2nd     0      0
  3rd    35     17
  Crew    0      0

,, Age = Child, Survived = No
```

```
      Sex
Class  Male Female
  1st     5      1
  2nd    11     13
  3rd    13     14
  Crew    0      0

,, Age = Child, Survived = Yes
```

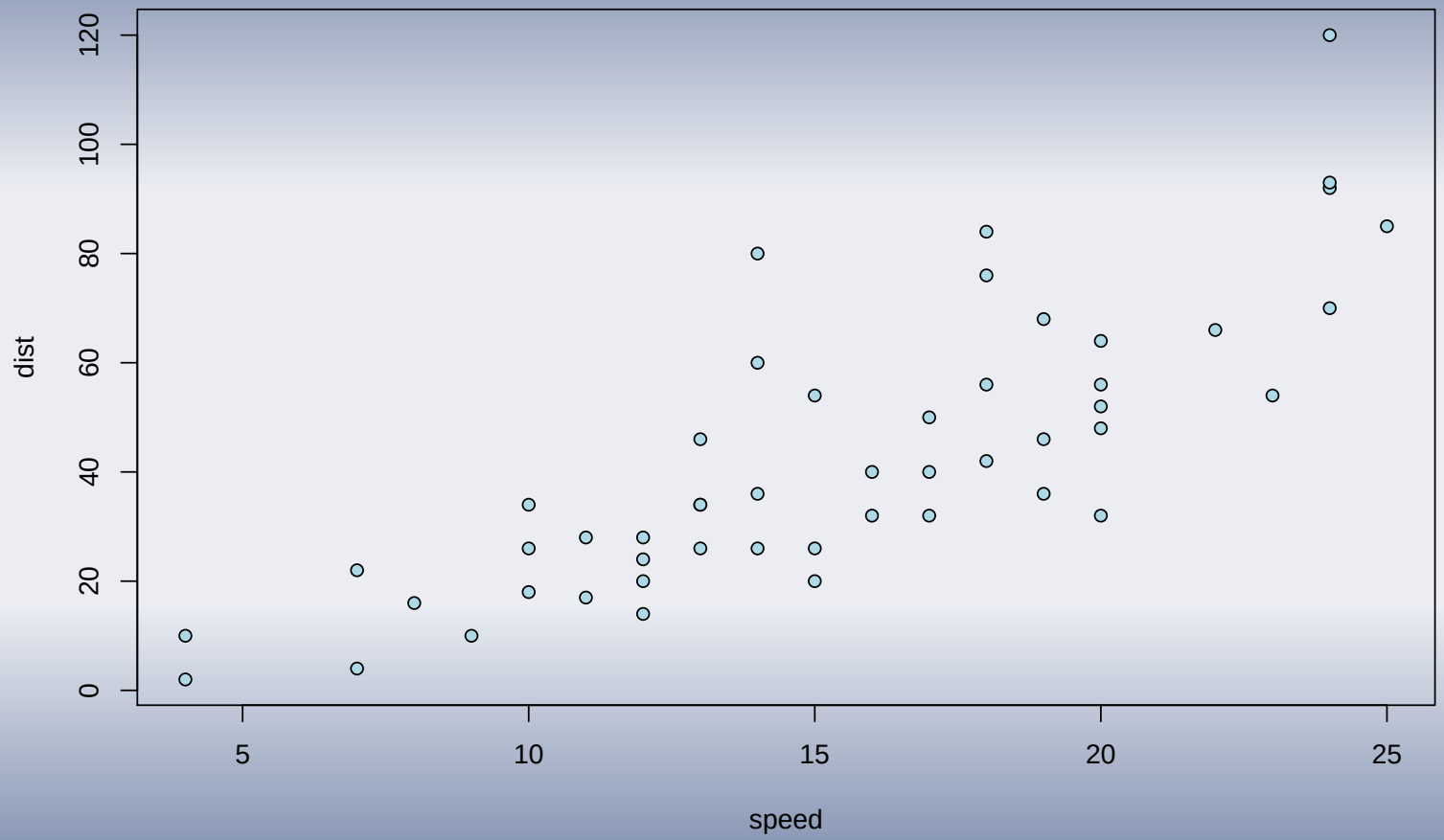
```
      Sex
Class  Male Female
  1st   118      4
  2nd   154     13
  3rd   387     89
  Crew  670      3

,, Age = Adult, Survived = No
```

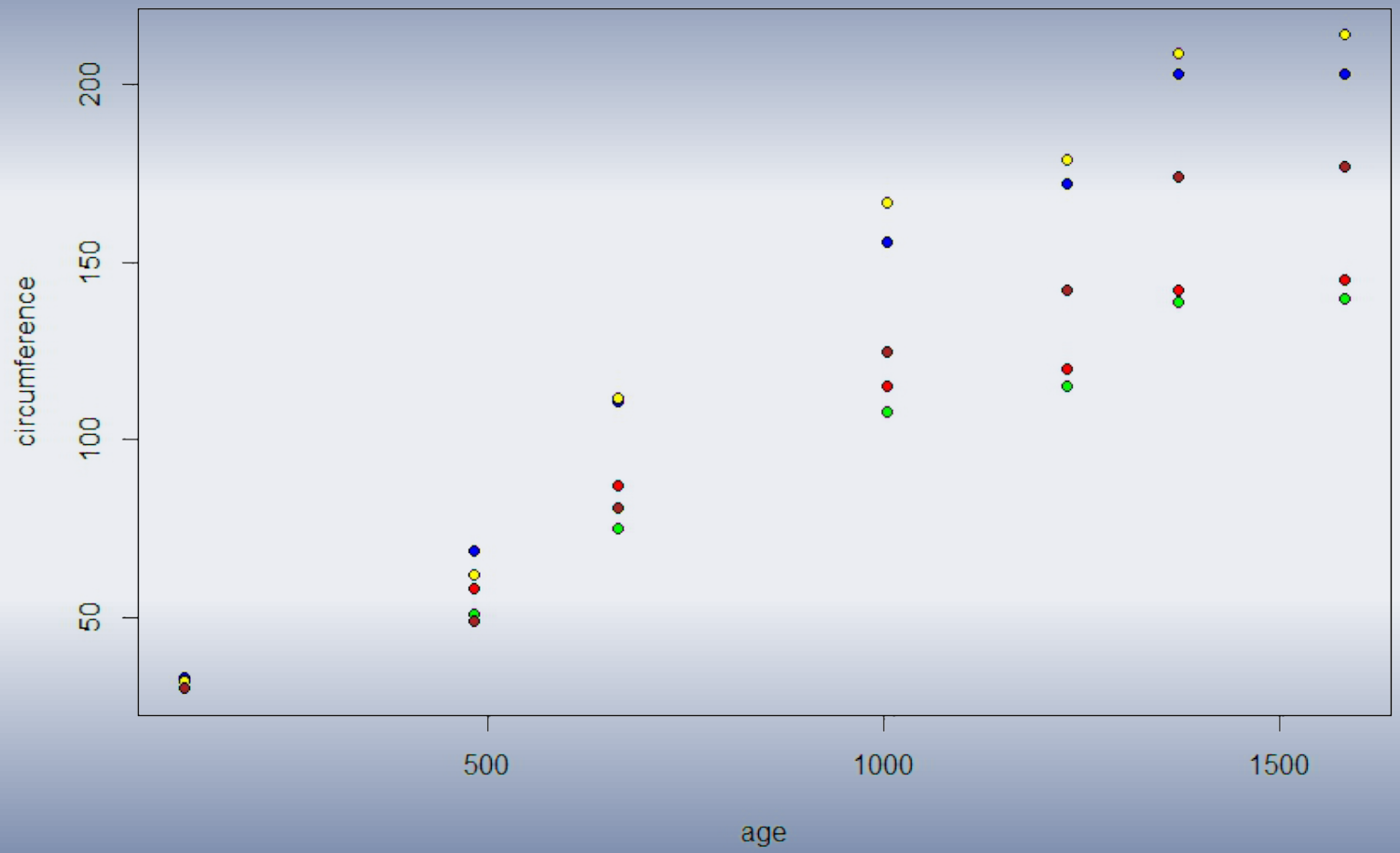
```
      Sex
Class  Male Female
  1st    57    140
  2nd    14     80
  3rd    75     76
  Crew  192     20

,, Age = Adult, Survived = Yes
```

Car Breaking Distance



Orange Trees



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- random sample $\rightarrow$ independent and identically distributed observations;

Sample Statistics

Two different worlds

...

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- sample mean $\equiv$ average

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  - arithmetic average of all given observations;
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- ❑ Some other proposals: sample trimmed mean, weighted mean, etc.;

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- middle observation from all ordered observations;
- $\tilde{x}_n = x_{(\frac{n+1}{2})}$ for n even and $\tilde{x}_n = [x_{(n/2)} + x_{(\frac{n+1}{2})}]/2$ for n odd;

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- Some other proposals as well ...;

Some other sample characteristics

- **sample mode (for categorical variables mostly);**
  What is the relation between sample mean, median and mode?
- **sample variance & sample standard error;**
  mostly it is difficult to imagine → sample range used "instead"
- **sample quantiles (quartiles, percentiles, etc.);**
  some of them are more important than others...
- **coefficient of variation;**
  spread of data relative to its middle value

To be continued...

- Probability, probability concepts;
- Random events, combination of events;
- Conditional probability;
- Independence principle;
- Law of Total Probability;
- Bayes Theorem in Probability;