Lecture 2: Datasets and variables

Introduction to Machine Learning

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L3 MIASHS | Semestre 2

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1 Datasets

- Definition
- Example

2 Variables

- Variable types
- Studying numeric variables
- Studying categorical variables

Reminder on previous session

In the previous session, we learned that **Machine Learning** algorithms are able to **learn**, **infer** and **predict** given **data**.

To build a Machine Learning algorithm, you need **data** !

Question

Can anyone tell me what a **dataset** is ?

Datasets

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A **dataset*** can be thought of as a matrix $M = (x_{i,j})_{1 \leq i \leq n, 1 \leq j \leq m}$ with n the number of individuals in the population and m the number of variables.

Columns of a table represents a **particular variable** (also called **feature**), and each row corresponds to a given **record** of the data set in question for an **individual**.

Datasets

Example:

Individual	Variable 1	Variable 2	Variable 3
ID1	5	4	1
ID2	2	3	1

Question:

Give the value for:

$x_{1,3} =$

$x_{2,1} =$

Variable 1 for individual 1

All data regarding individual 2

Example of dataset

The Iris dataset was introduced by the British statistician and biologist Ronald Fisher in his 1936 paper *The use of multiple measurements in taxonomic problems*.

ID	Sepal length	Sepal width	Petal length	Specie
1	2.1	3.1	4.1	Setosa
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Does anyone from lecture 1 remember for what type of problem is the **Iris dataset used for** ?

Example of dataset

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The names of the variables are:
There are ______ individuals.
There are ______ variables.

Variables

Variable types

Question

Can anyone list the different types of variables that can be encountered in datasets ?

Variable types

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- **Categorical**: $(x_{i,j})_{1 \leq i \leq n} \in \mathcal{X}^n$, with $\mathcal{X}$ a set of distinct values.
  A special case of categorical variables often encountered .
  Example: **Flower specie**.

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- **Ordinal**: $(x_{i,j})_{1 \leq i \leq n} \in \mathcal{X}^n$, with $\mathcal{X}$ a set of **ordered** distinct values.
  Example: **Performance (low, medium, high)**.

Dataset analysis

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Analysis depends on the variable type !
A poor analysis of variables can cause misinterpretation of data.

Dataset analysis

Question

Can anyone give me:

- Possible **graphical representation** of **numeric** and **categorical** variables ?
- Possible **estimators** of **numeric** and **categorical variables** ?

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- **Quantiles**: divide the ordered vectors into equal parts of same

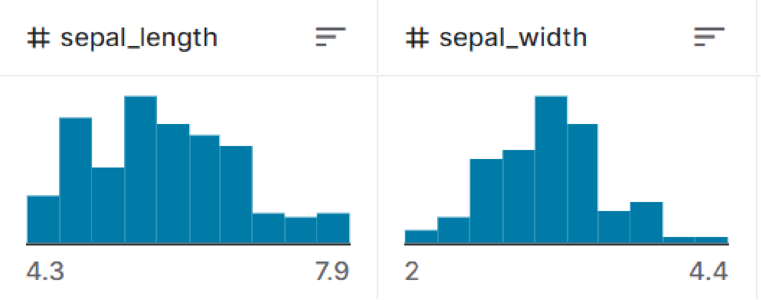
  $1/4$ quantiles, median

  Very useful for datasets with a lot of outliers*!

Representing numeric variables: histograms

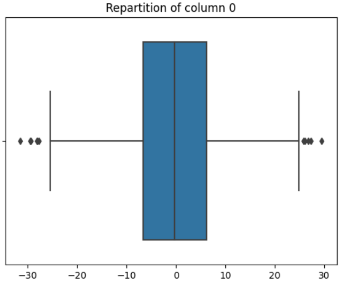
Histograms* consist in:

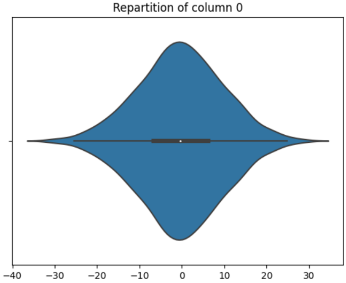
- Dividing the numerical space into intervals of regular length
- Computing the frequency of values per interval



Representing numeric variables: boxplots

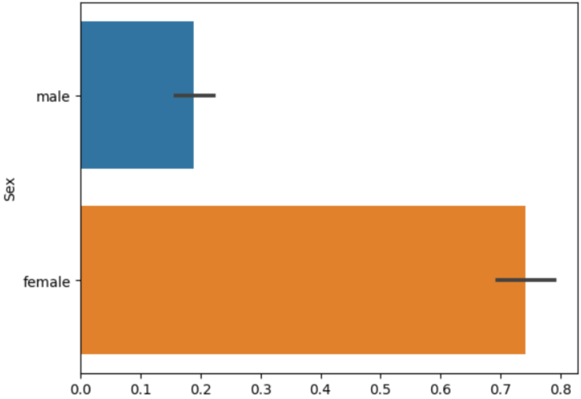
Boxplots* and **violin plots*** consist in representing all the values of the variables and their statistical indicators (usually, quantiles and medians).





Analyzing and representing categorical variables

Categorical variables are often **harder** to study.
Usual indicators are **counts** and **frequency**.
Usual graphical representation can be **bar graphs**.



Questions

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