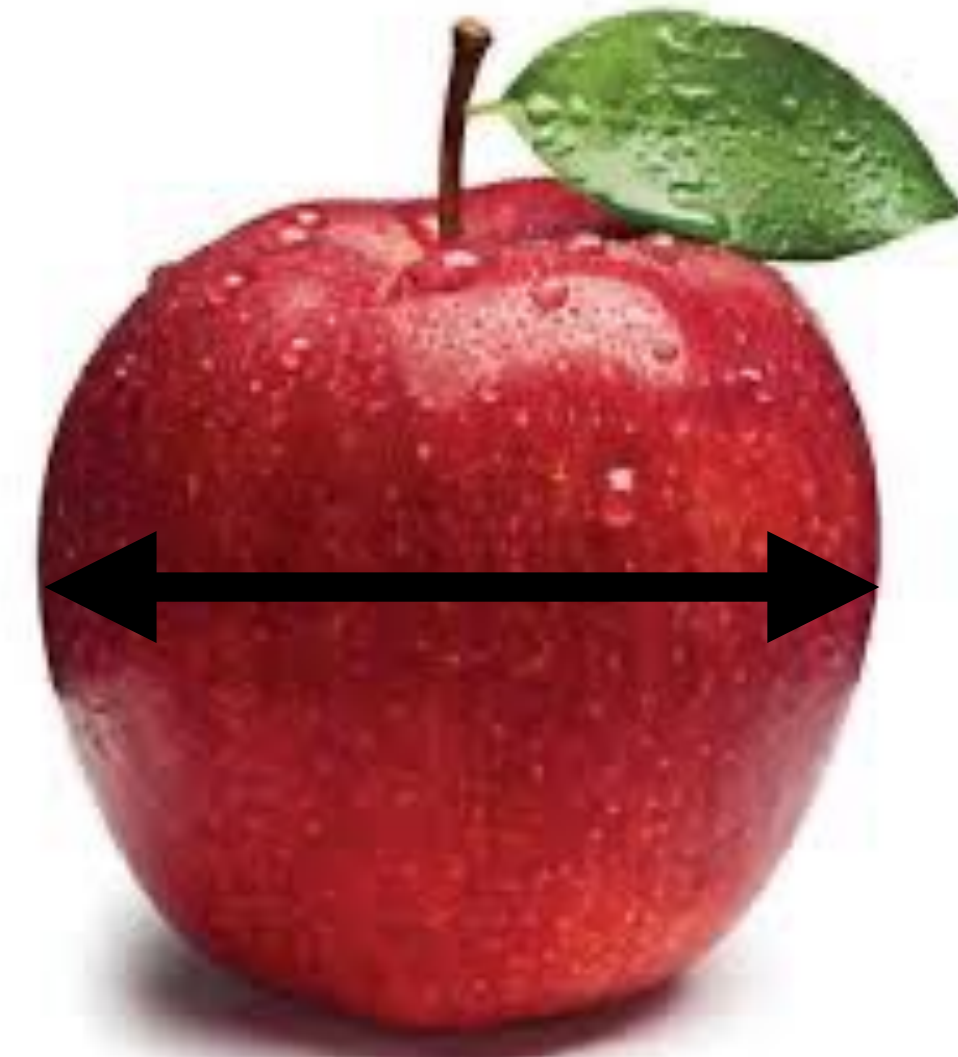


# Class 12: Single variable data analysis

Instructor: Michael Szell

Oct 4, 2019

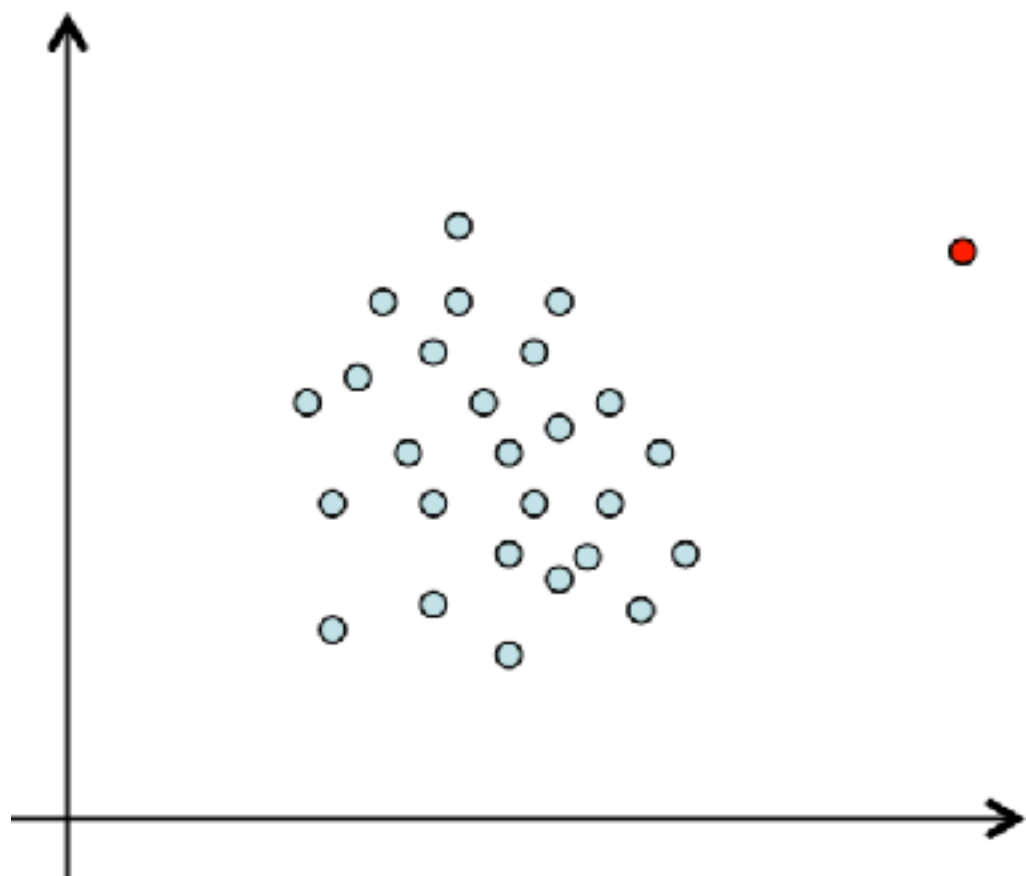


# Today you will learn first steps in analyzing data

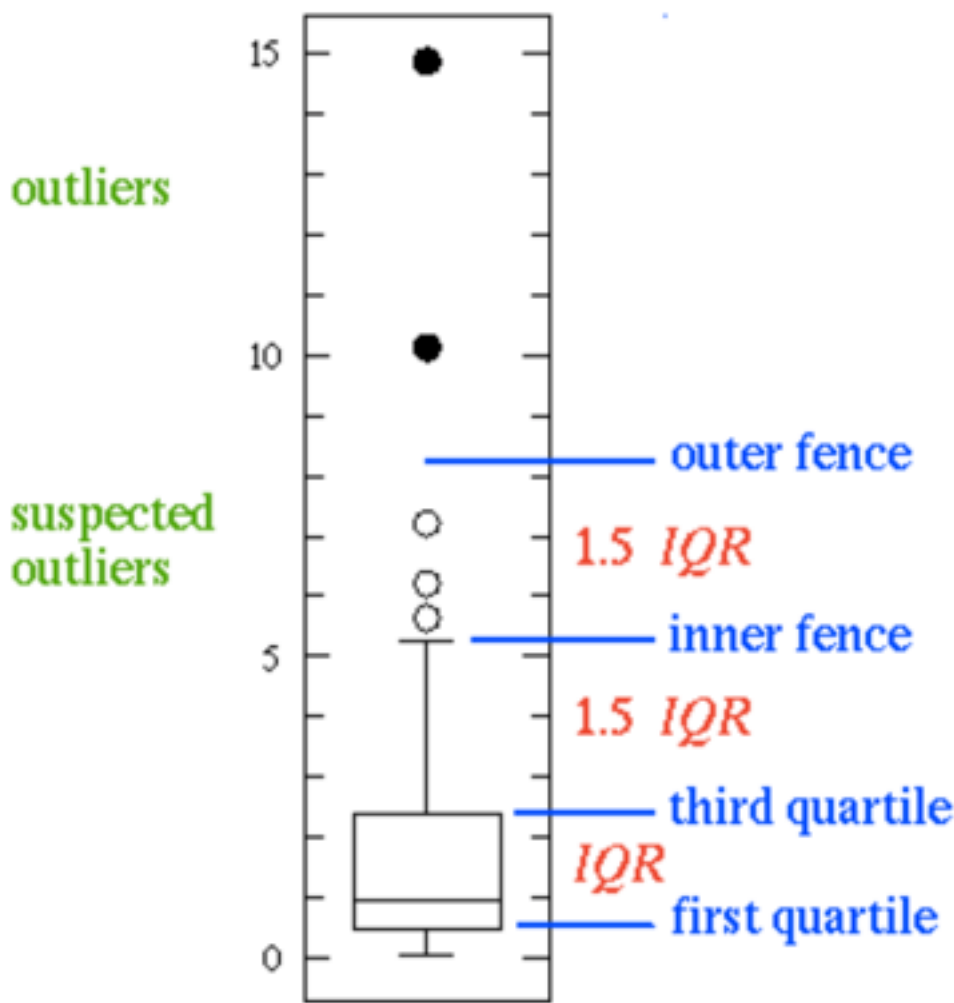
## Variable types



## Exploratory data analysis

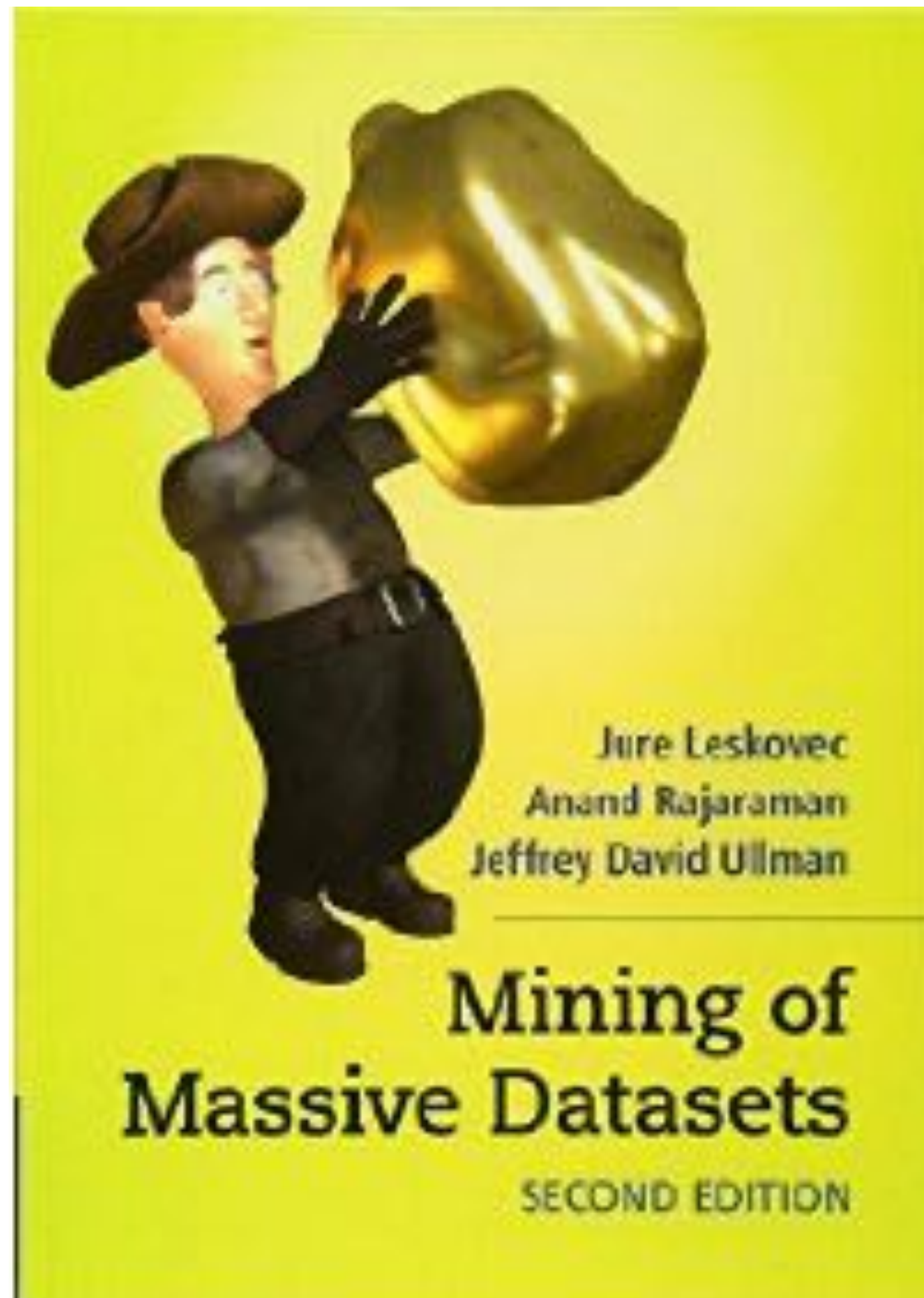


## Describing data





# We need data analysis to create knowledge from data



Computerization produces massive amounts of data

Knowledge discovered from data can be used for

- competitive advantage
- scientific advances

We need smart, automatized tools to deal with the massive data

*We are drowning in data but starving for knowledge*

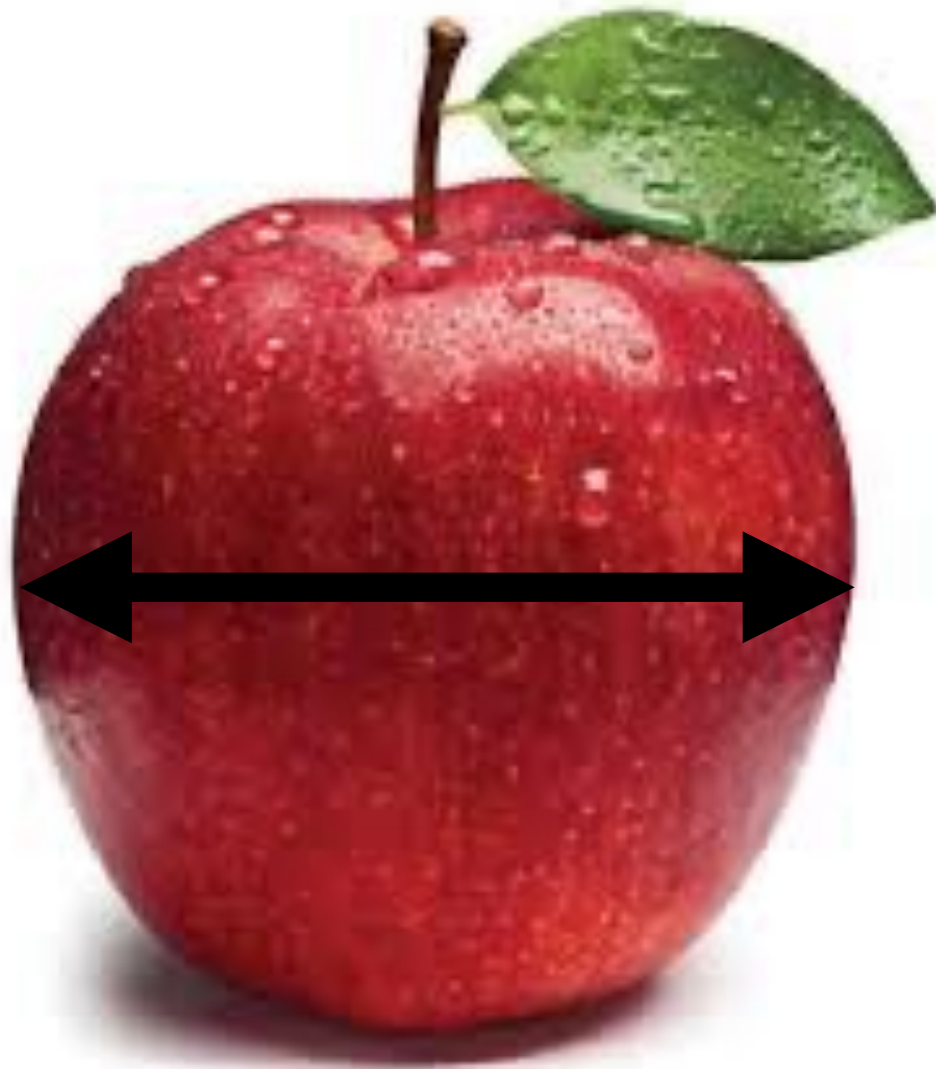
**Data analysis** is the process of:

Cleaning, transforming, exploring and/or modeling data

with the goal of discovering useful information,  
informing conclusions or decision-making

# There are 3 types of data analysis

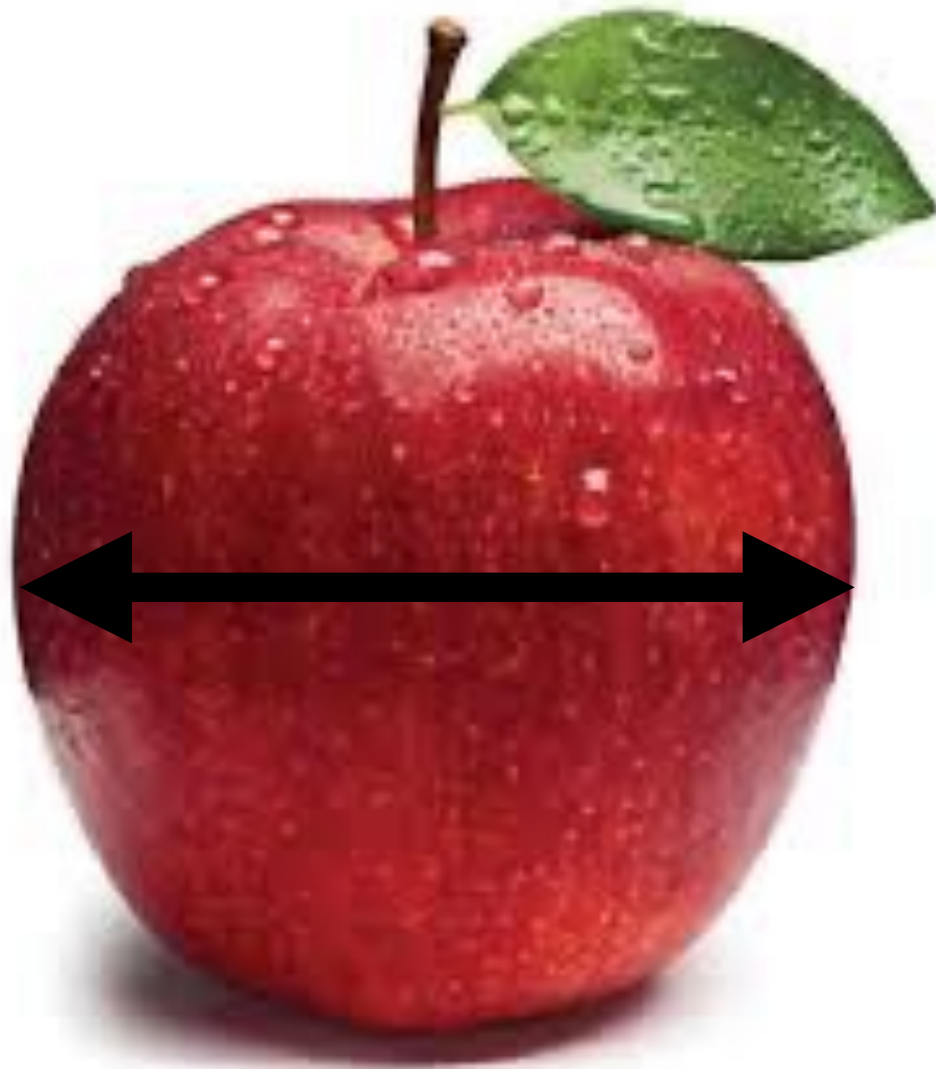
## 1) Descriptive statistics



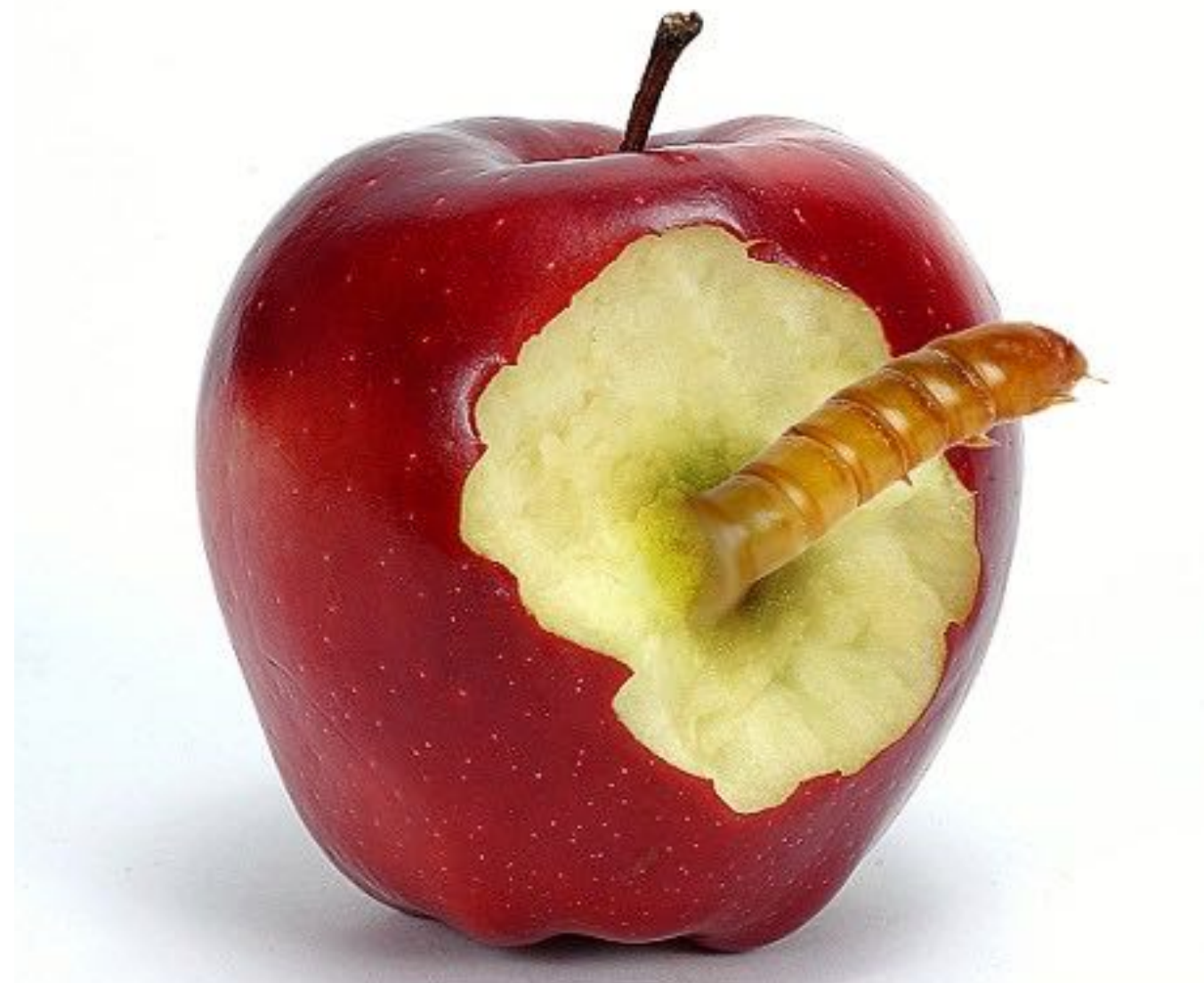


# There are 3 types of data analysis

## 1) Descriptive statistics



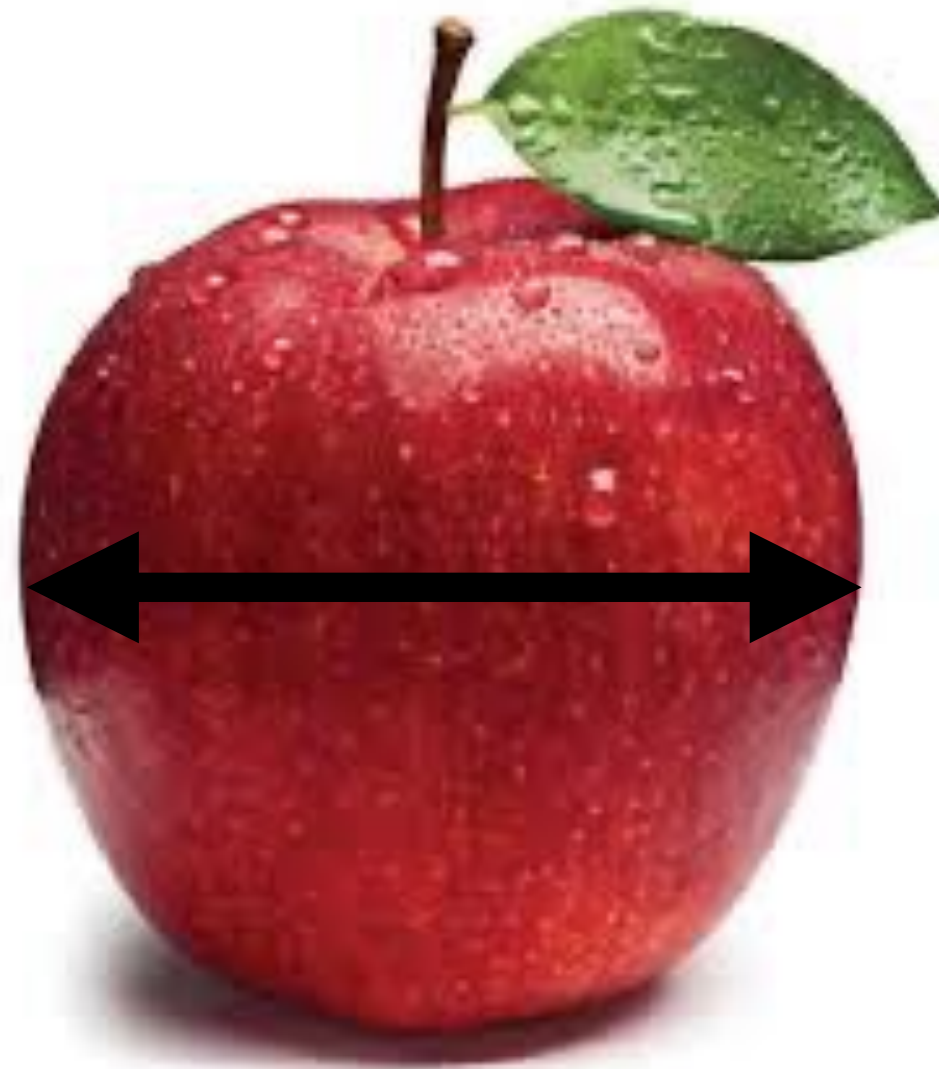
## 2) Exploratory



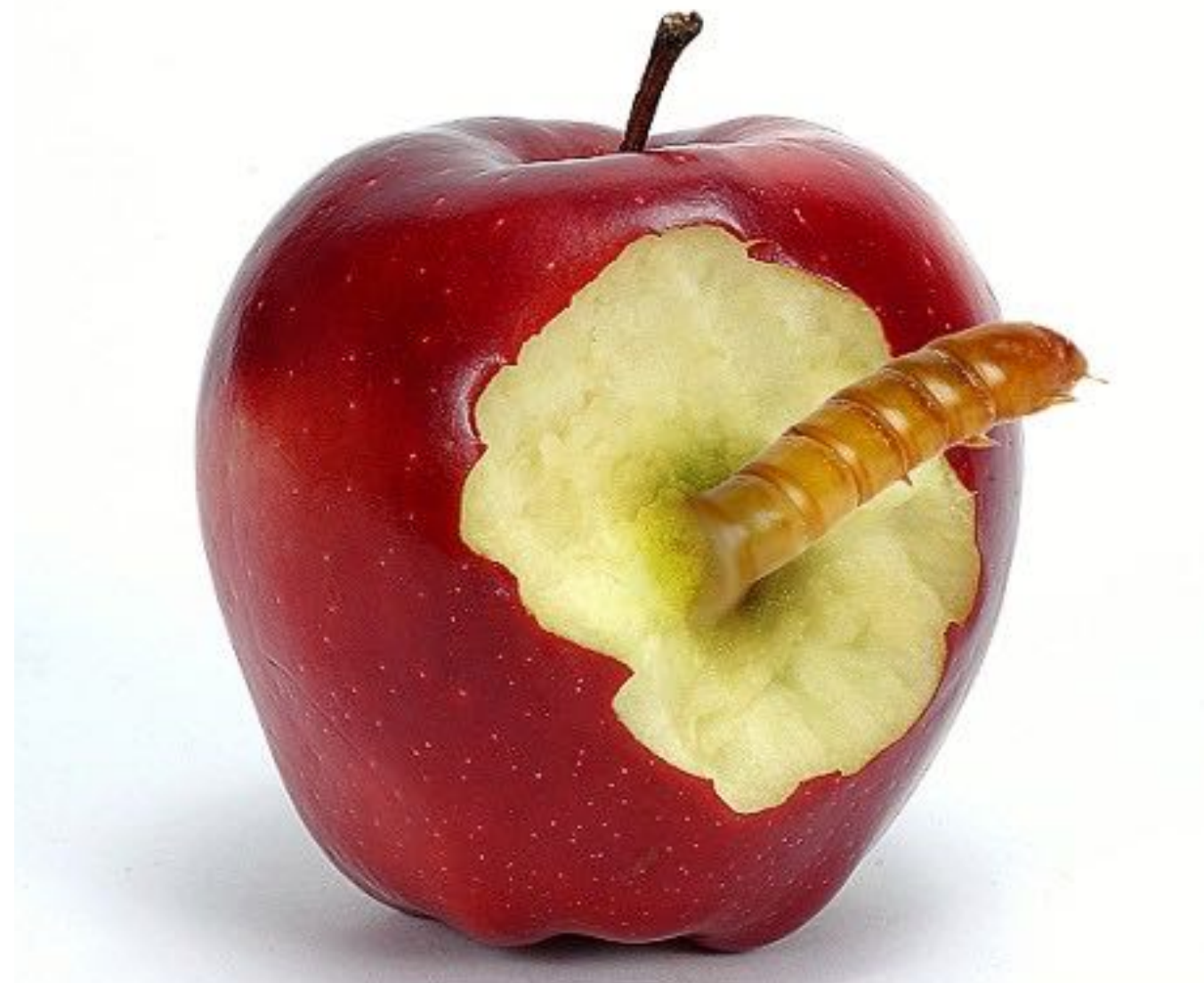


# There are 3 types of data analysis

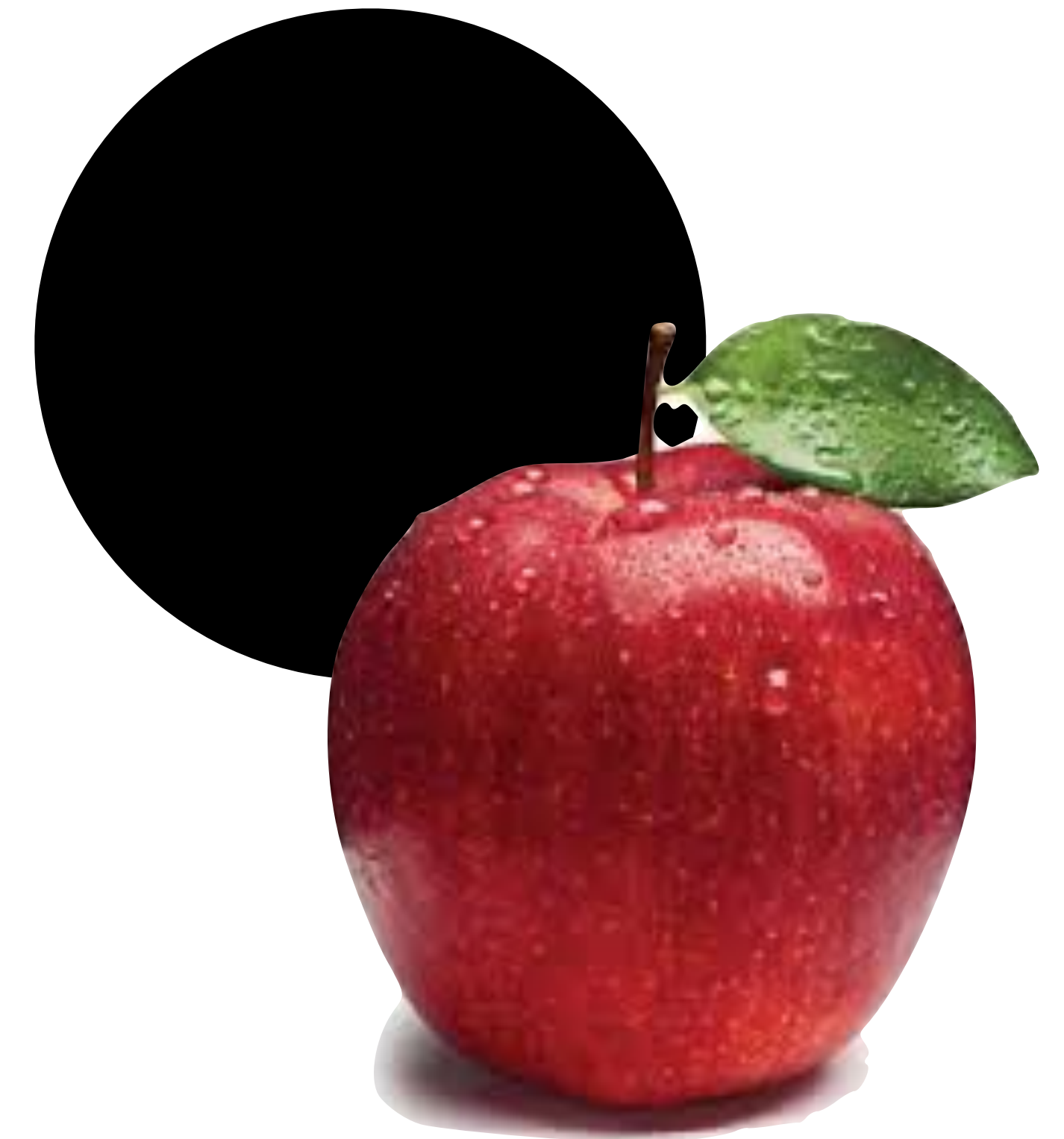
## 1) Descriptive statistics



## 2) Exploratory



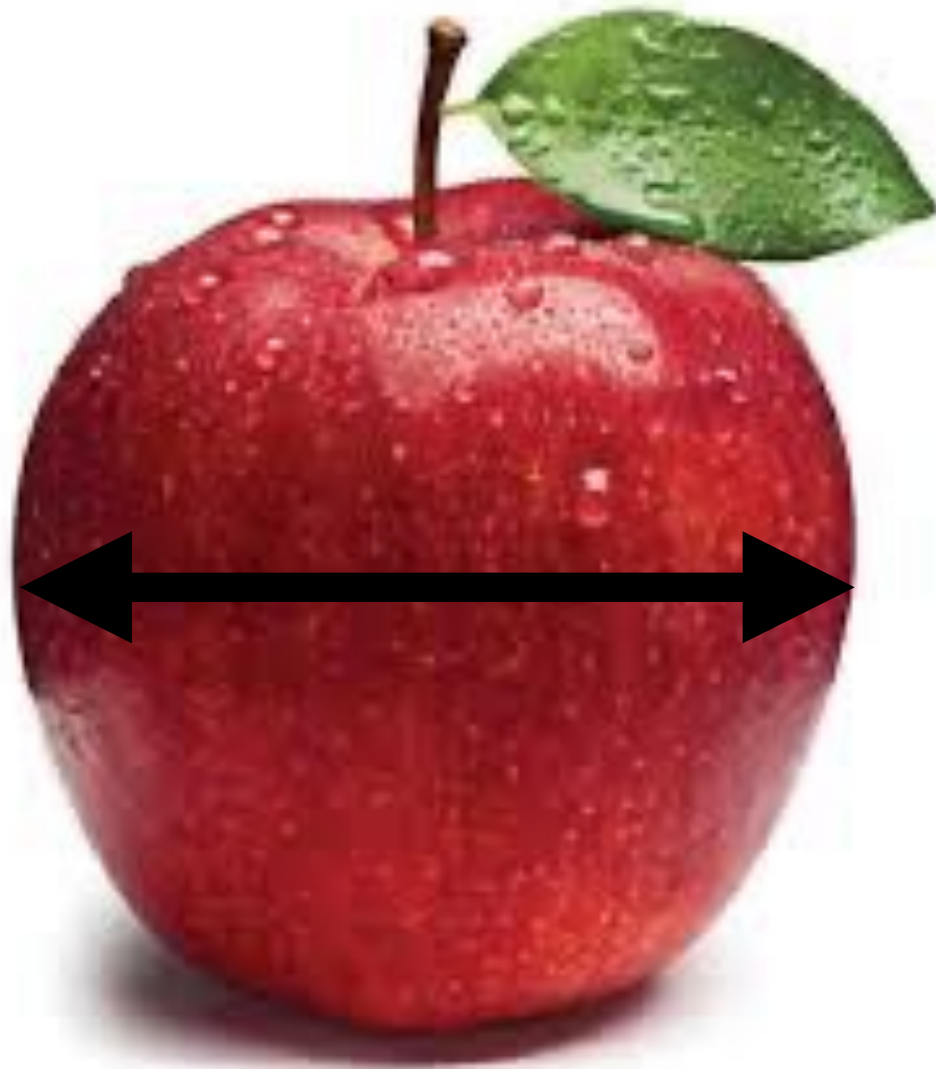
## 3) Inferential statistics (Hypothesis testing)



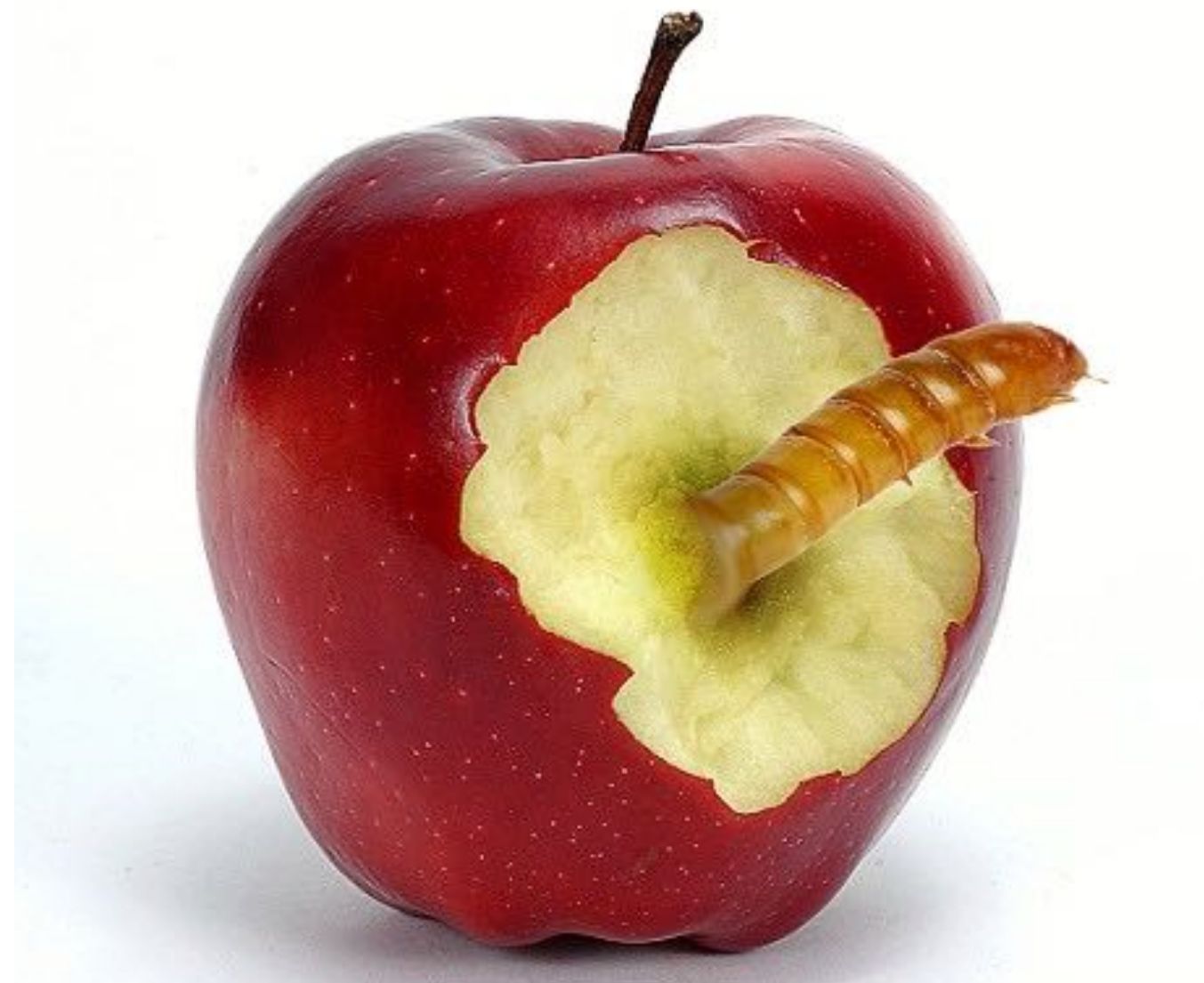


# Today we focus on descriptive statistics and exploration

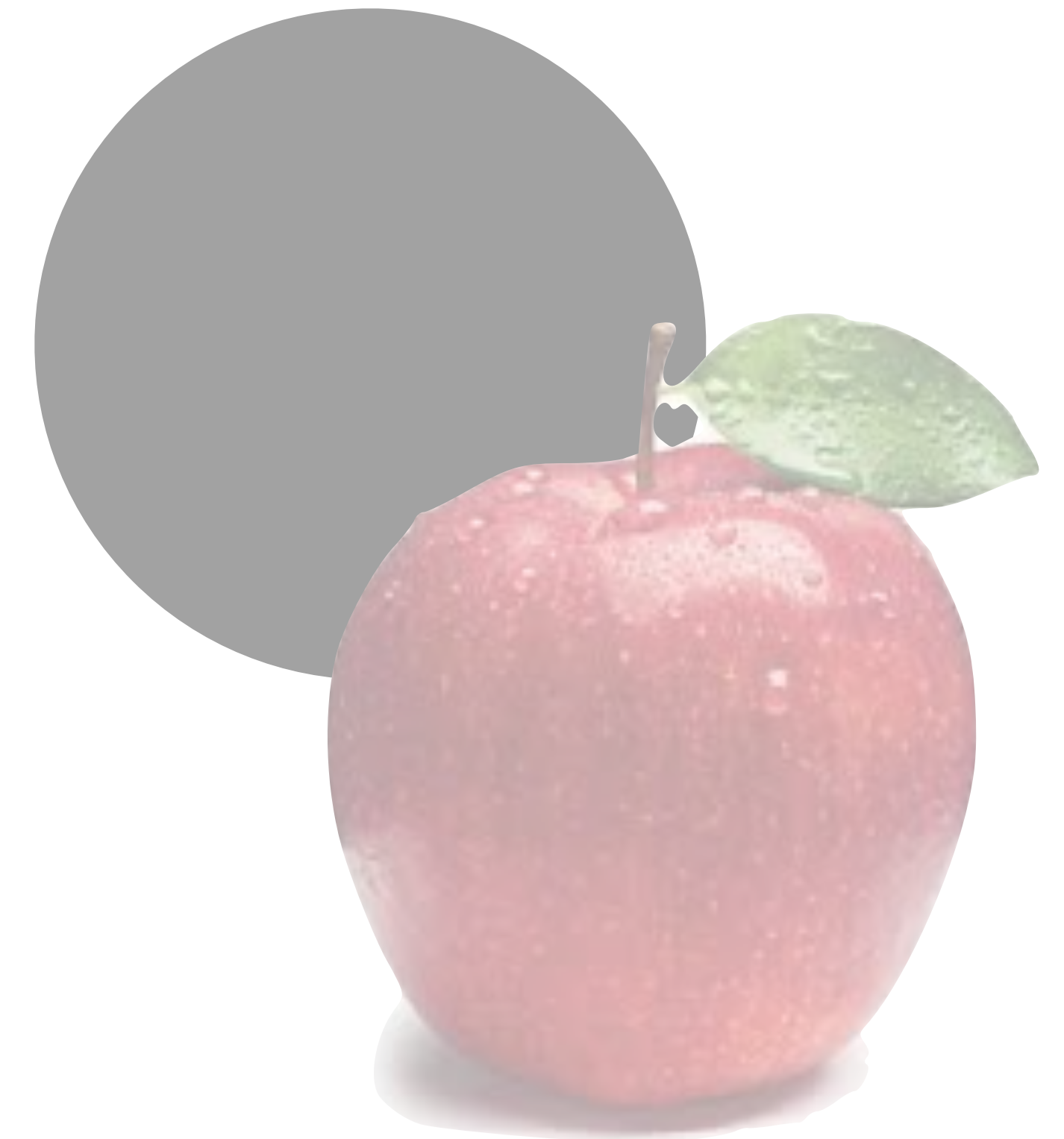
## 1) Descriptive statistics



## 2) Exploratory



## 3) Inferential statistics (Hypothesis testing)





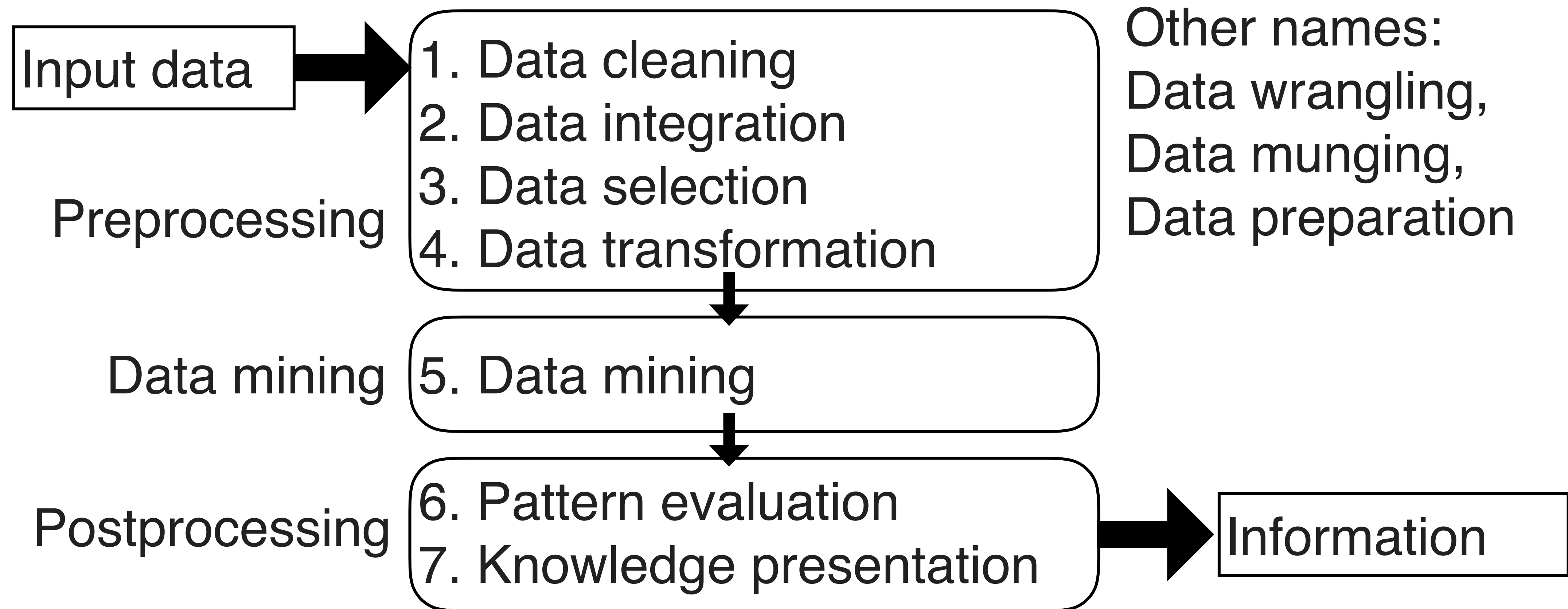
**Data mining** is a data analysis technique focusing on **prediction**





# There are many steps in data mining/analysis

Data Mining is short for Knowledge Discovery from Data (KDD):





# Data sets have objects and attributes

## Data set

Student ID	Year	Grade Point Average (GPA)	...
▶ 1034262	Senior	3.24	...
1052663	Sophomore	3.51	...
1082246	Freshman	3.62	...
	⋮		

# Data sets have objects and attributes

Data set

Attributes

Student ID	Year	Grade Point Average (GPA)	...
⬢ 1034262	⋮ Senior	3.24	...
1052663	Sophomore	3.51	...
1082246	Freshman	3.62	...
⋮	⋮		

Data object

**Data object** = record, individual, point, event, observation, vector, entity

**Attribute** = field, feature, variable, dimension, characteristic



# In today's class we will deal with single-variable analysis

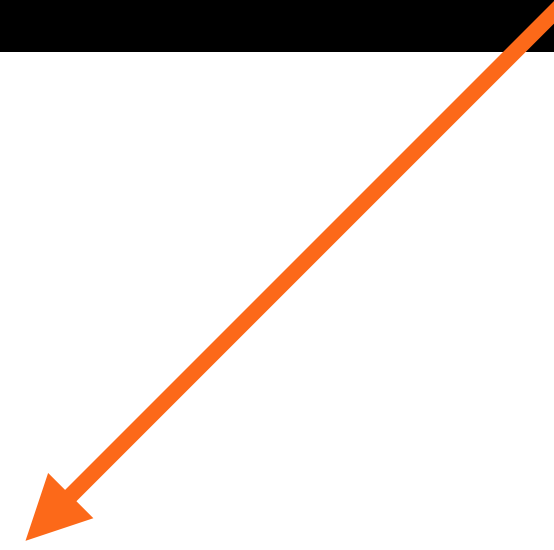
## Data set

Student ID	Year	Grade Point Average (GPA)	...
▶ 1034262	Senior	3.24	...
1052663	Sophomore	3.51	...
1082246	Freshman	3.62	...
	⋮		

**Data object** = record, individual, point, event, observation, vector, entity

**Attribute** = field, feature, **variable**, dimension, characteristic

There are two types of variables: **categorical** and quantitative



Places an individual  
into one of several  
categories





# Categorical variables can be nominal or ordinal

Places an individual  
into one of several  
categories



No order



Order



# There are two types of variables: categorical and quantitative

Places an individual into one of several categories



Takes values for which arithmetic operations make sense





# Quantitative variables can be **interval** or **ratio**

Places an individual into one of several categories



Takes values for which arithmetic operations make sense



Differences  
meaningful



Ratios also  
meaningful



# Categorical

Places an individual into one of several categories



Nominal



Ordinal

# Quantitative

Takes values for which arithmetic operations make sense



Interval



Ratio

# Quiz results

Zip code  
Student ID

Nominal

Street number

Ordinal

C°

Interval

Age  
K°

Ratio



# Jupyter

# Outliers can be a sign for low data quality

**Outliers** (anomalous objects or values):

- 1) Data objects that have characteristics different from most others,  
or
- 2) Values of an attribute that are unusual



# Outliers can be a sign for low data quality

**Outliers** (anomalous objects or values):

- 1) Data objects that have characteristics different from most others,  
or
- 2) Values of an attribute that are unusual

This is not just noise! An outlier is an event that is suspected of not being generated by the same mechanisms as the rest of the data.

# Outliers can be legitimate, interesting objects



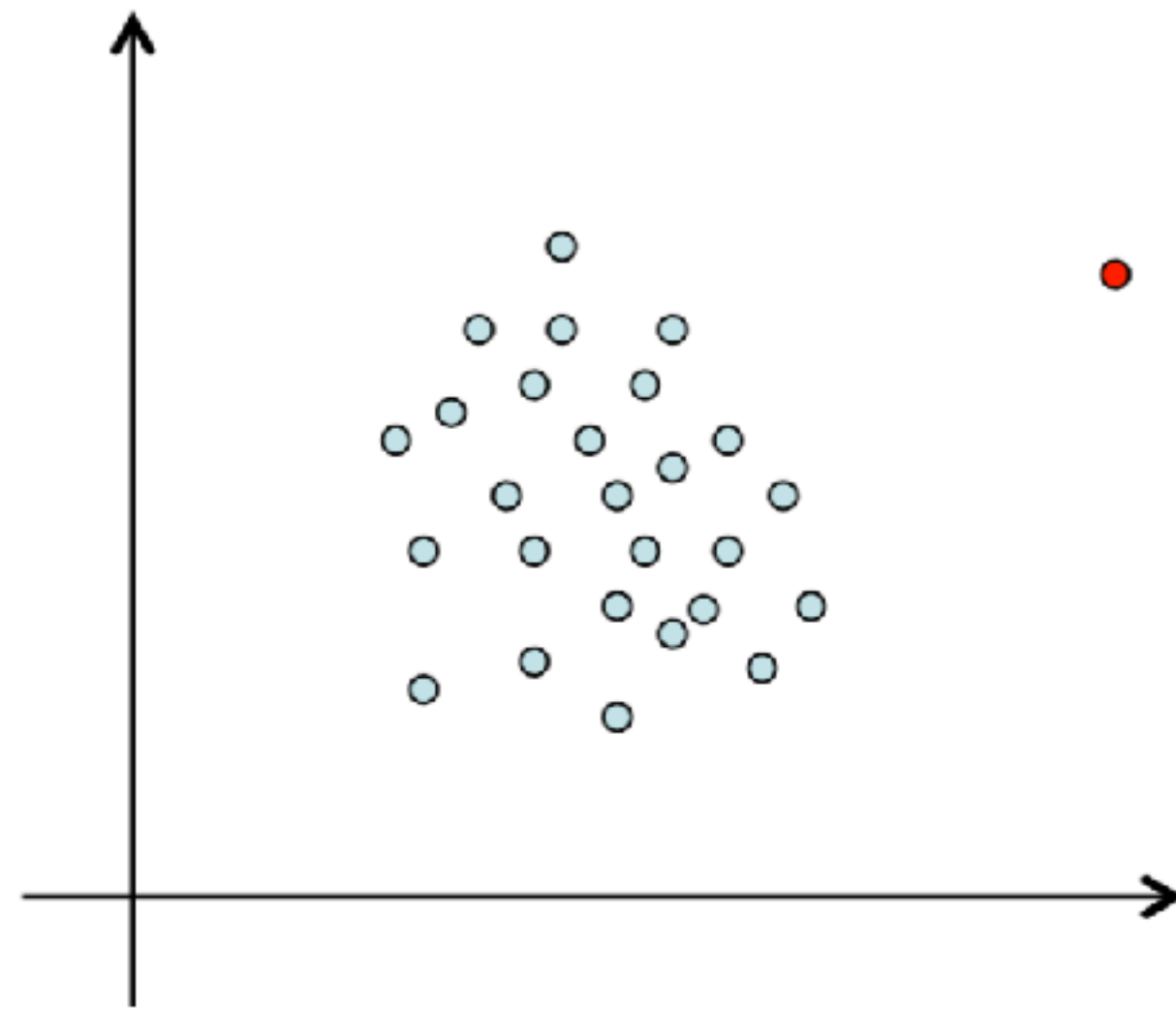
Fraud



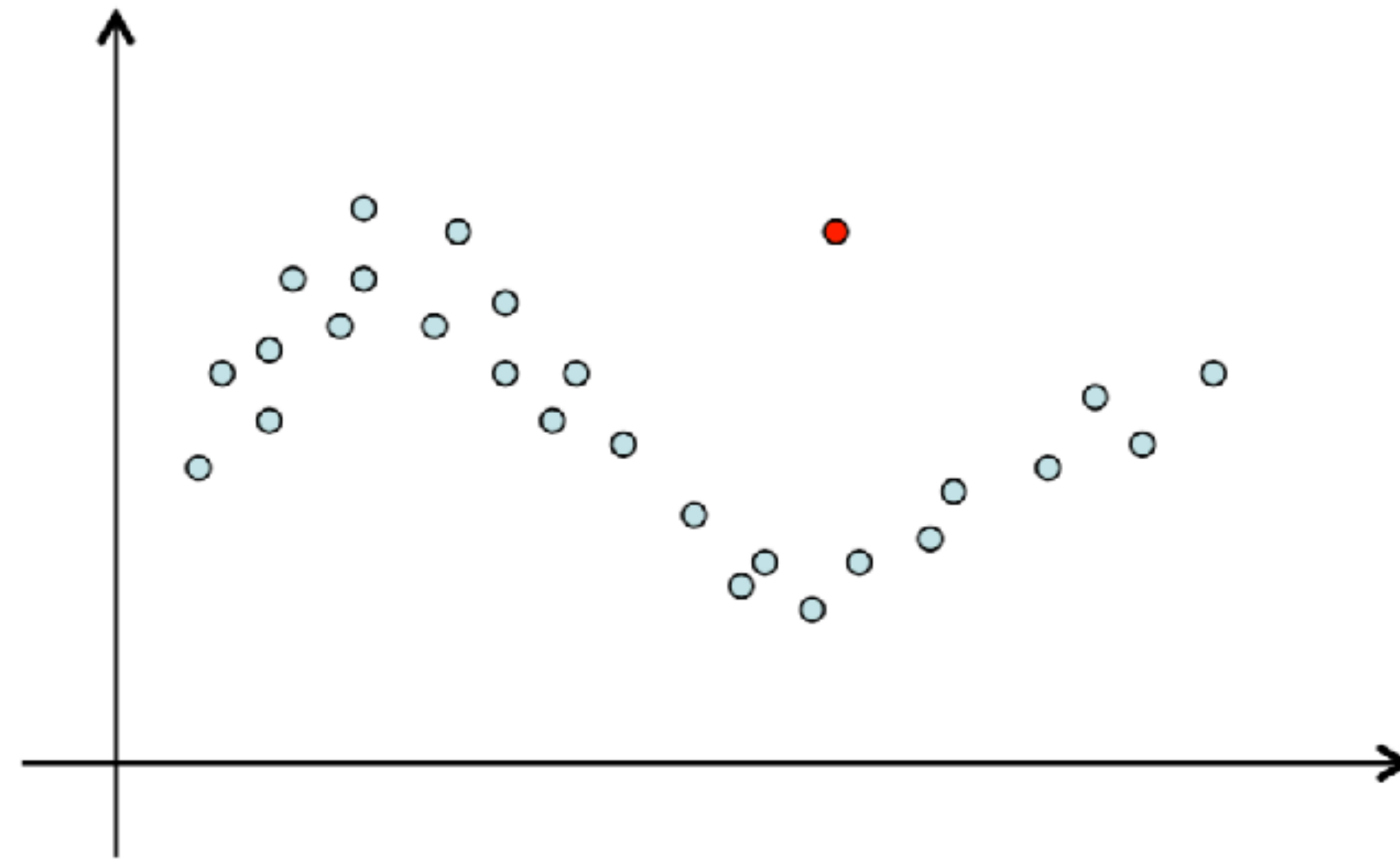
Innovation



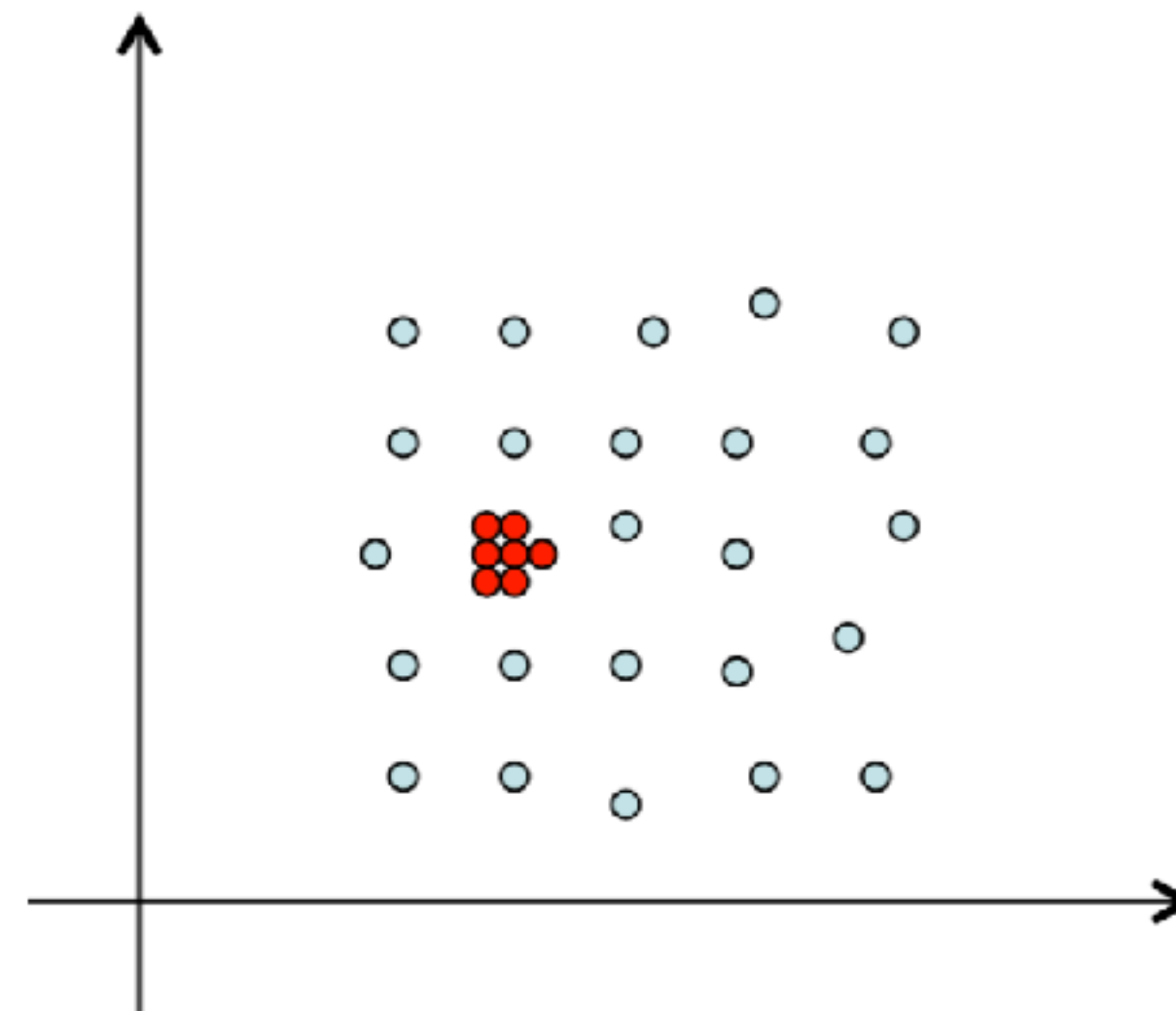
# There are different kinds of outliers



Global outliers

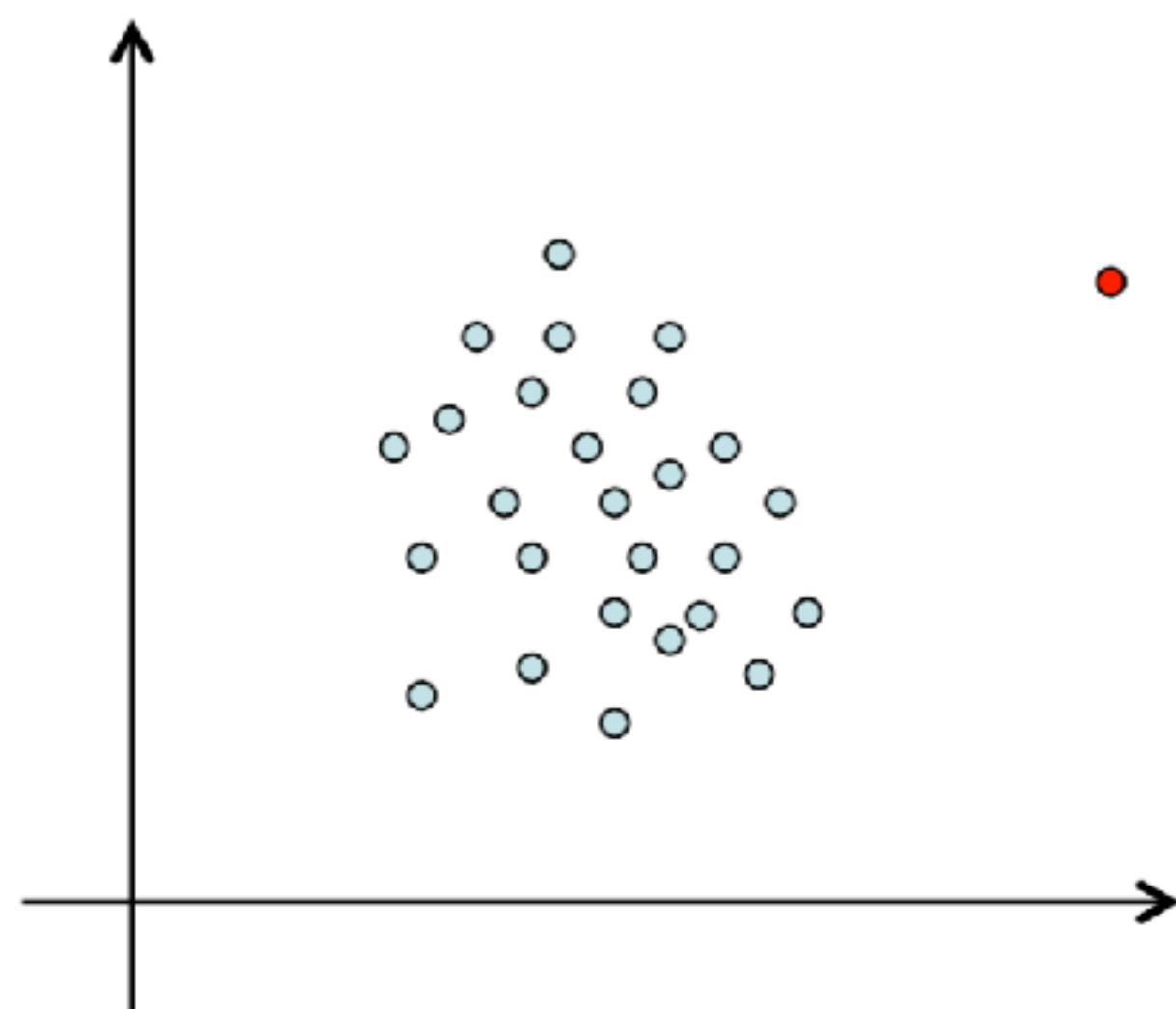


Contextual outliers



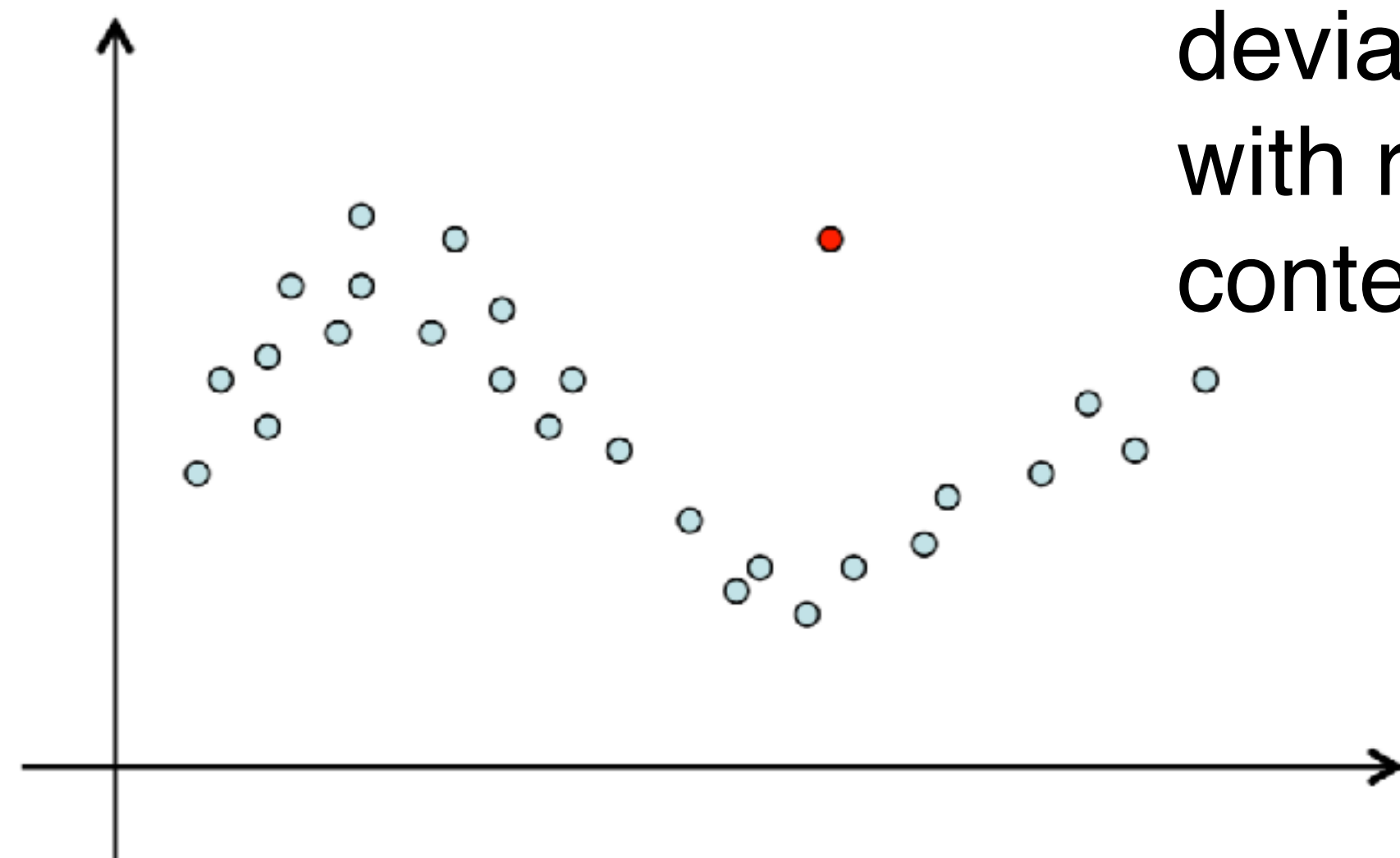
Collective outliers

# There are different kinds of outliers



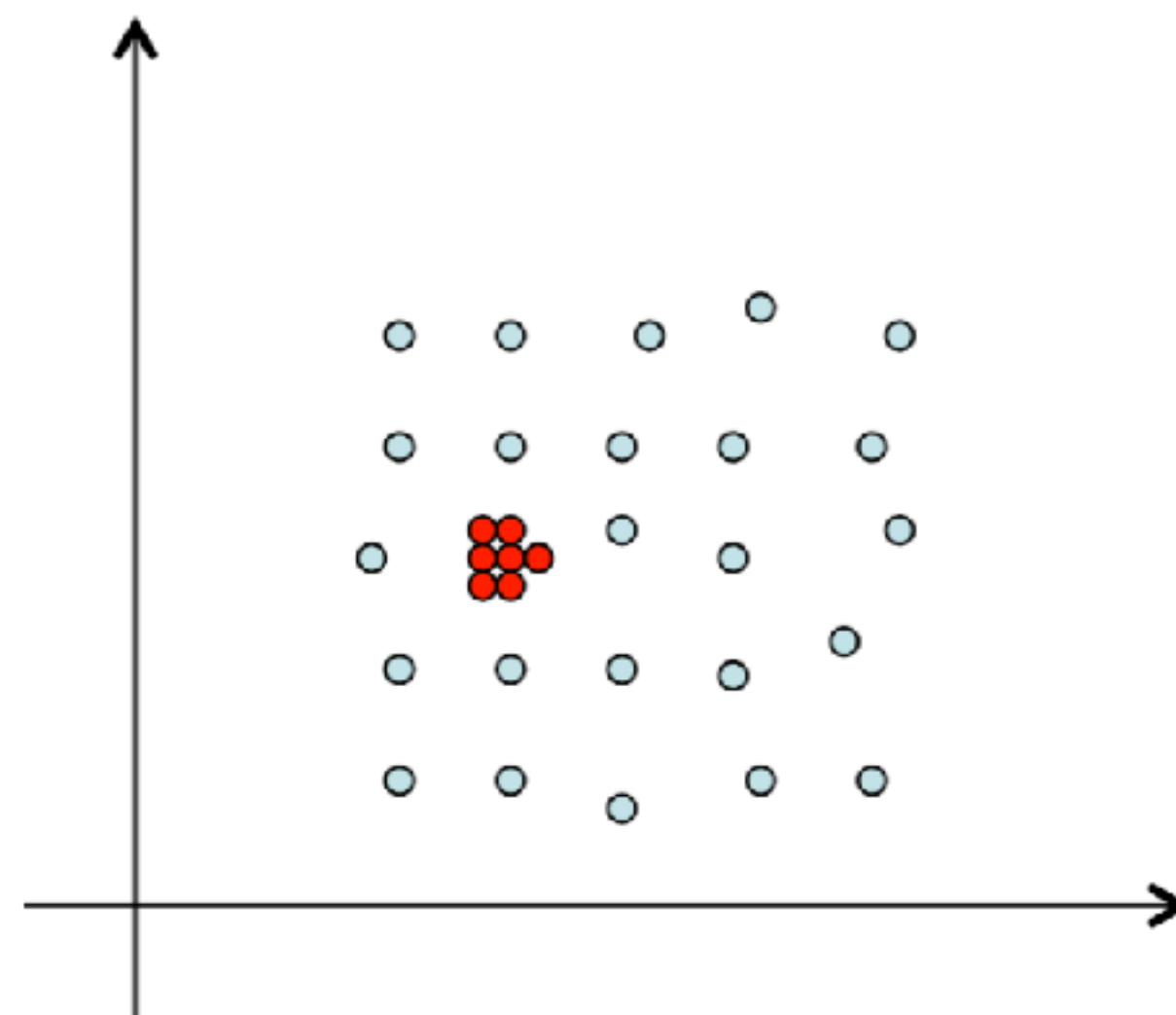
Global outliers

deviates significantly from the rest of the data. Also called: point anomaly



deviates significantly with respect to a given context of the object

Contextual outliers



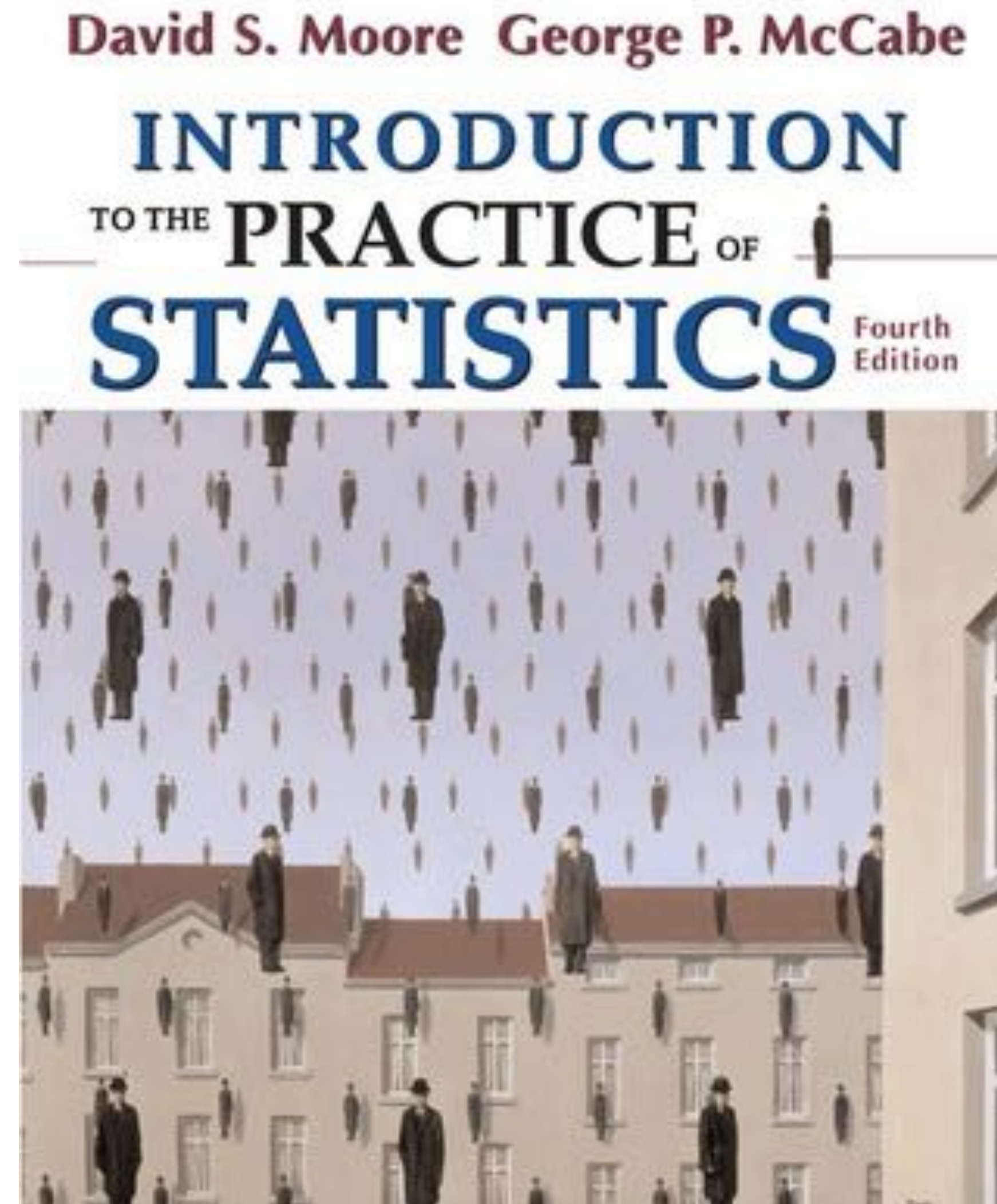
Collective outliers

a subset of data objects that as a group deviate significantly from the typical behavior of the entire data set.

An individual object of these collective outliers might not be an outlier itself.



# Sources and further materials for today's class



## Chapter 1