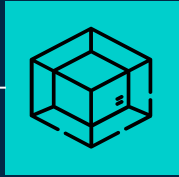




# Clustering in a nutshell

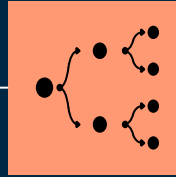
Hemza NEDJARI BENHADJ ALI

Open Week 3.0



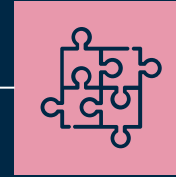
01

General approach of  
clustering



02

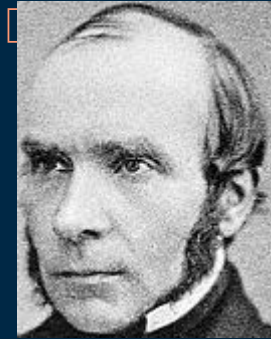
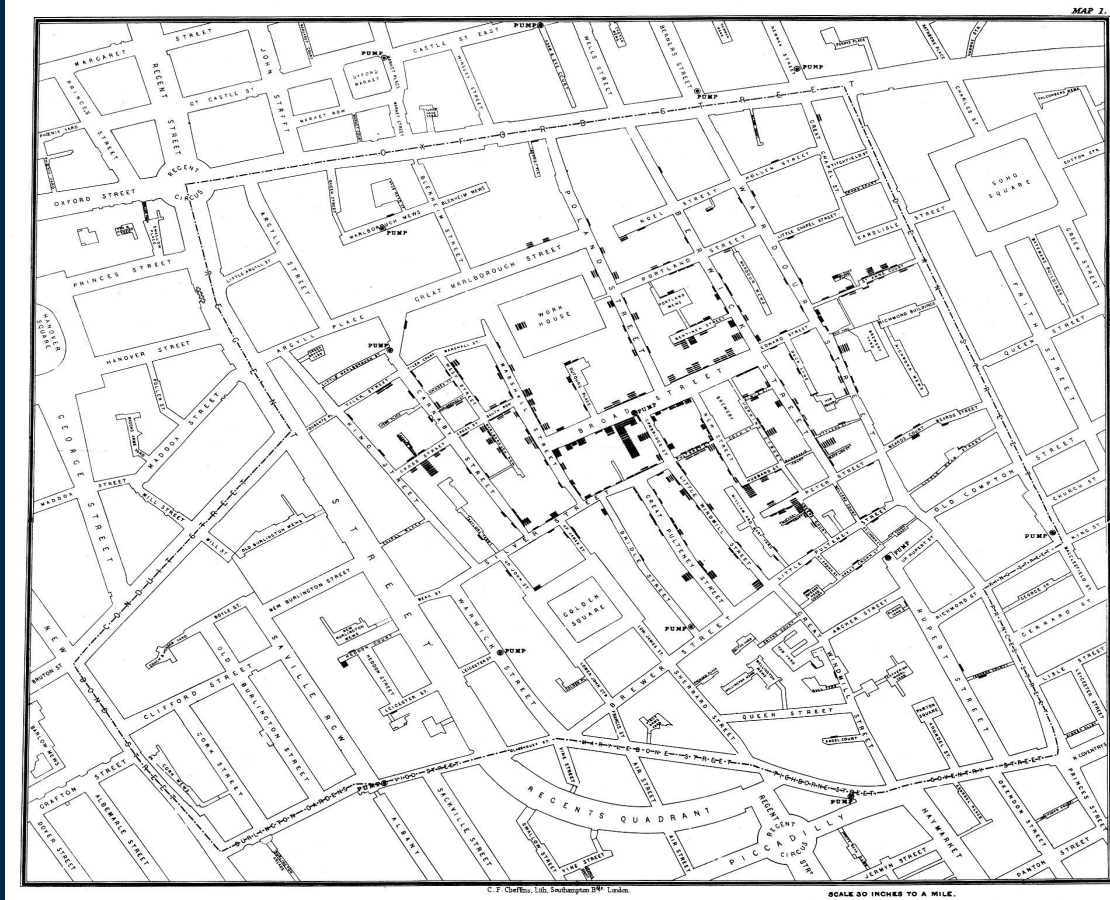
K-means  
Algorithm



03

Final thoughts

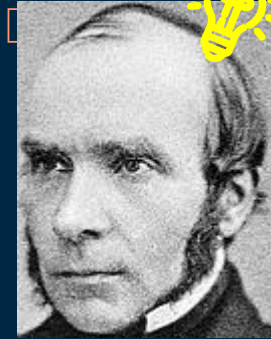
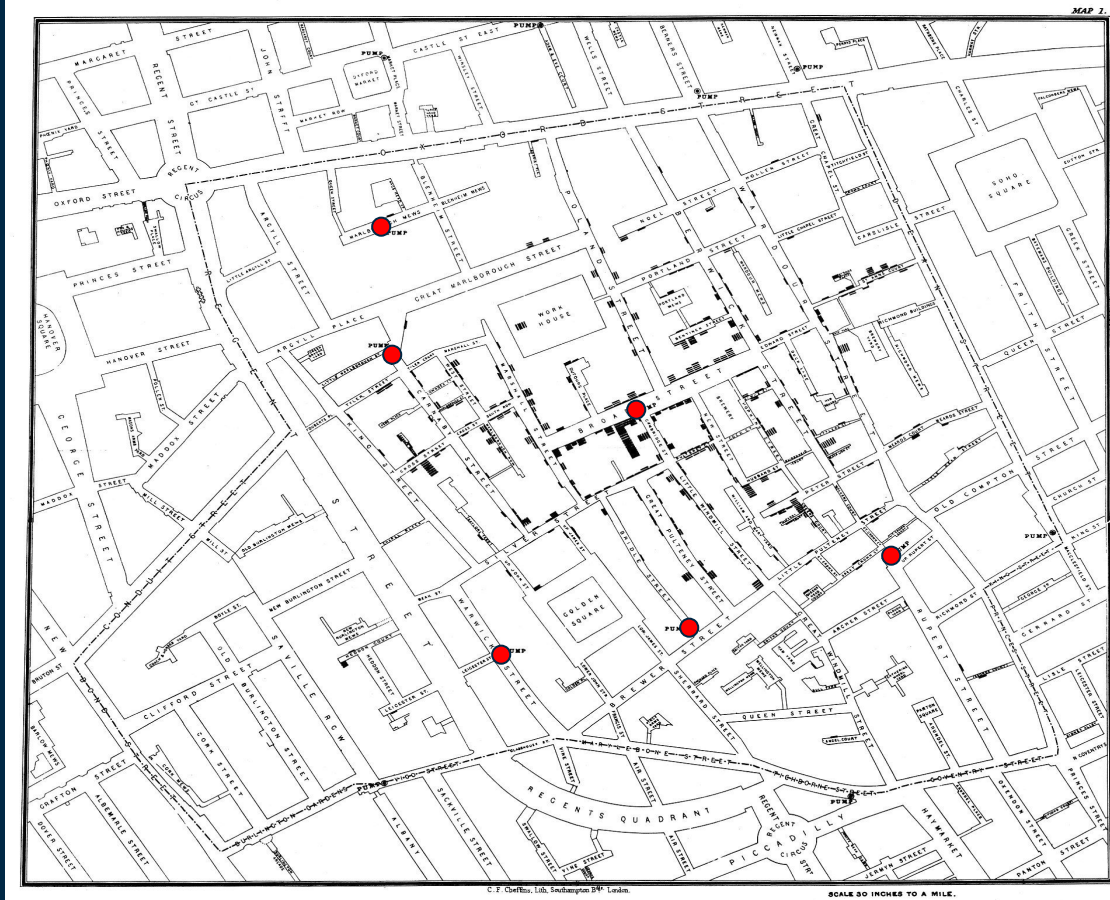
# Once upon a time ...



**John SNOW**

British physician  
(1813 – 1858)

# Once upon a time ...

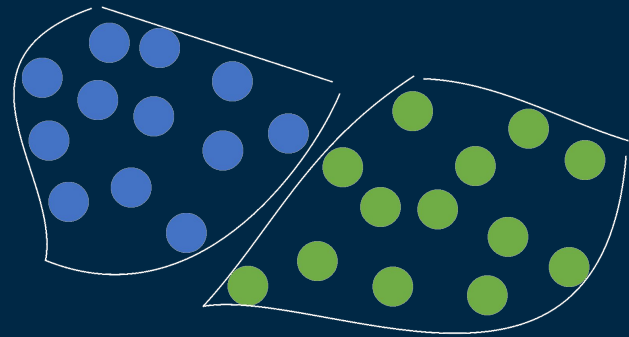
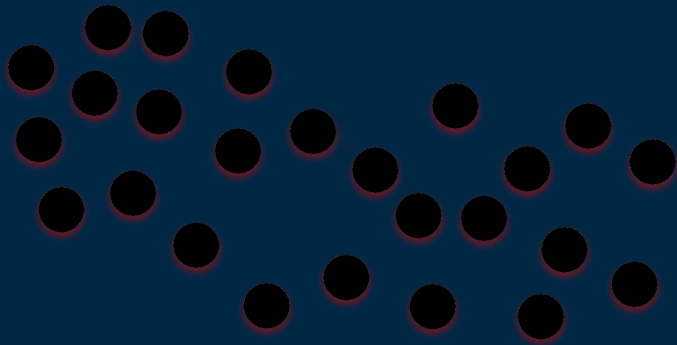


**John SNOW**

British physician  
(1813 – 1858)

# Clustering

- The organization of **unlabeled data** into **similarity** groups called **clusters**.
- A cluster is a collection of data items which are “similar” between them, and “dissimilar” to data items in other clusters



# How can we do Clustering ?

- Proximity measure
- Criterion function
- Algorithm

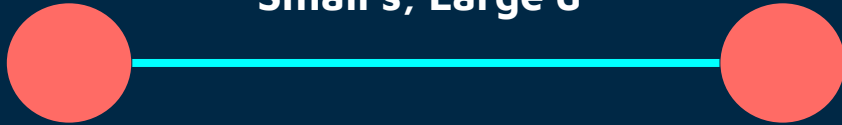


# How can we do Clustering ?

## 1 . Proximity measure

- Similarity  $s(x,y)$  : Large if  $x$  and  $y$  are similar.
- Dissimilarity (distance)  $d(x,y)$  : small if  $x$  and  $y$  are similar.

**Small  $s$ , Large  $d$**



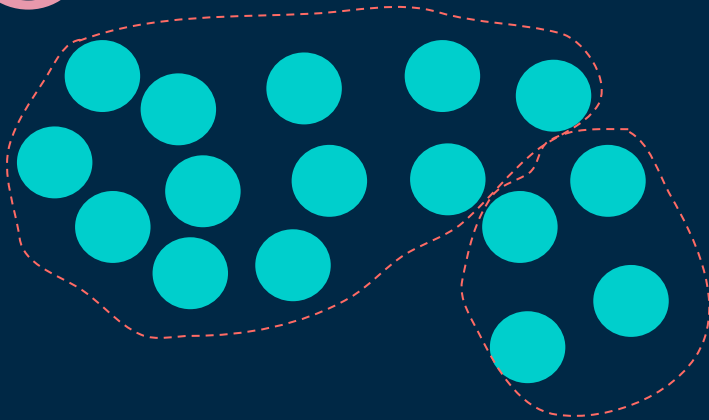
**Large  $s$ , Small  $d$**



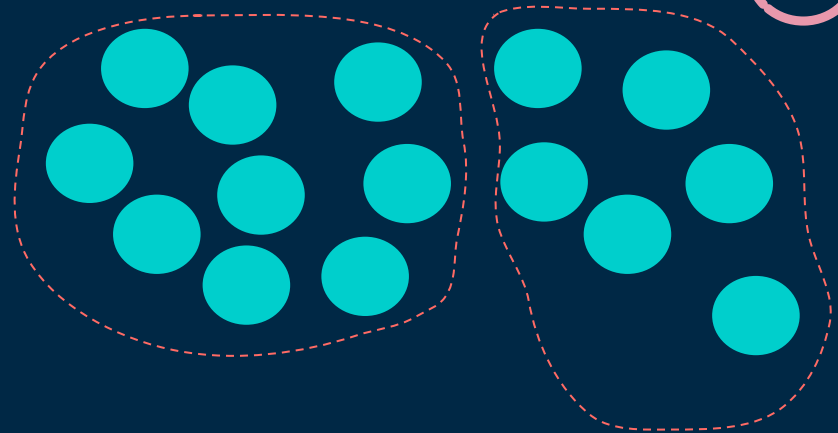
# How can we do Clustering ?

## 2 . Criterion function

A formula to evaluate the quality of the clustering



vs.

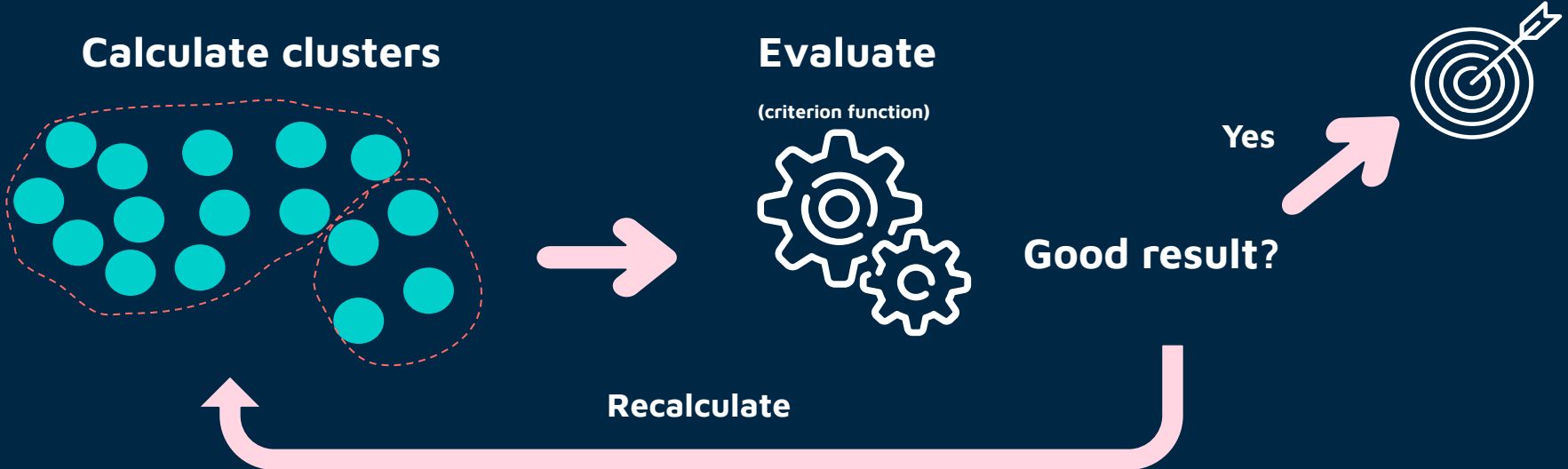




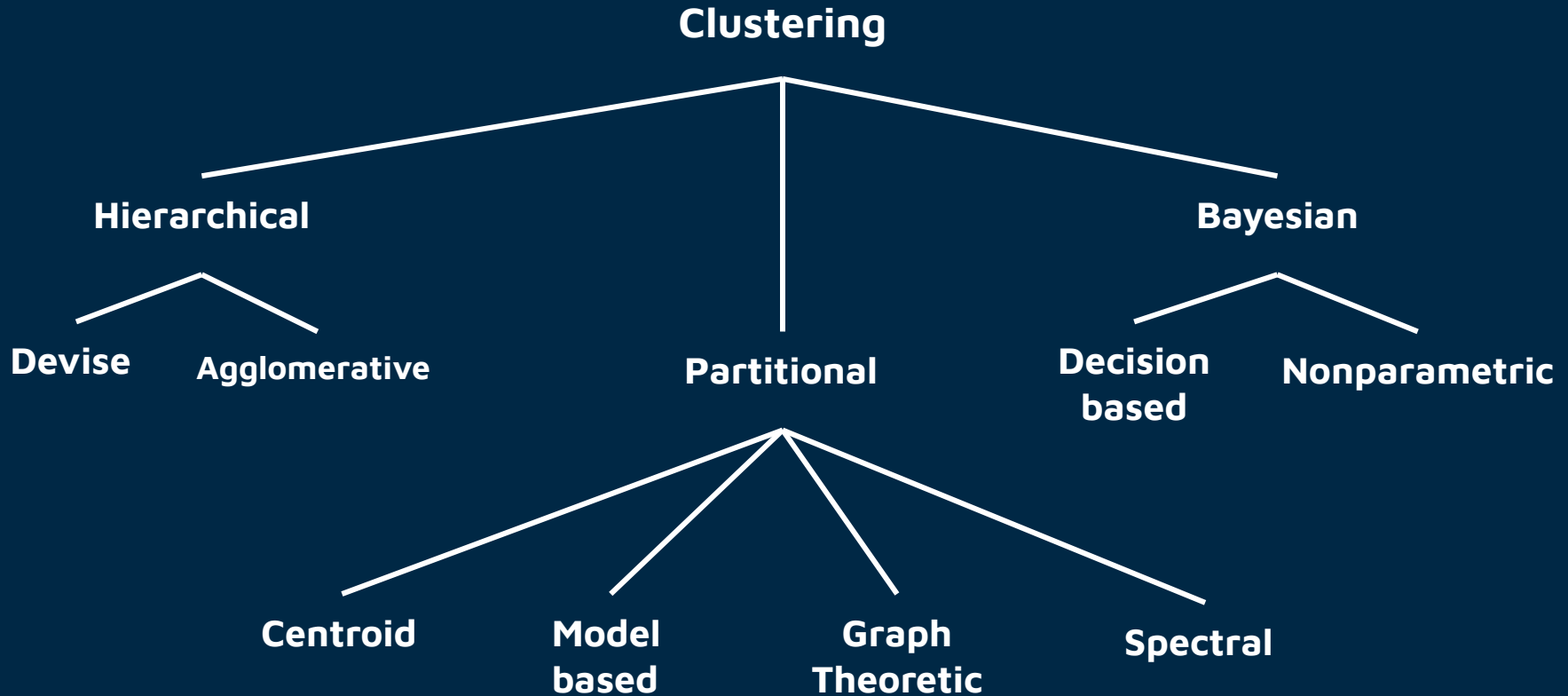
# How can we do Clustering ?

## 3 . Algorithm to compute the clustering

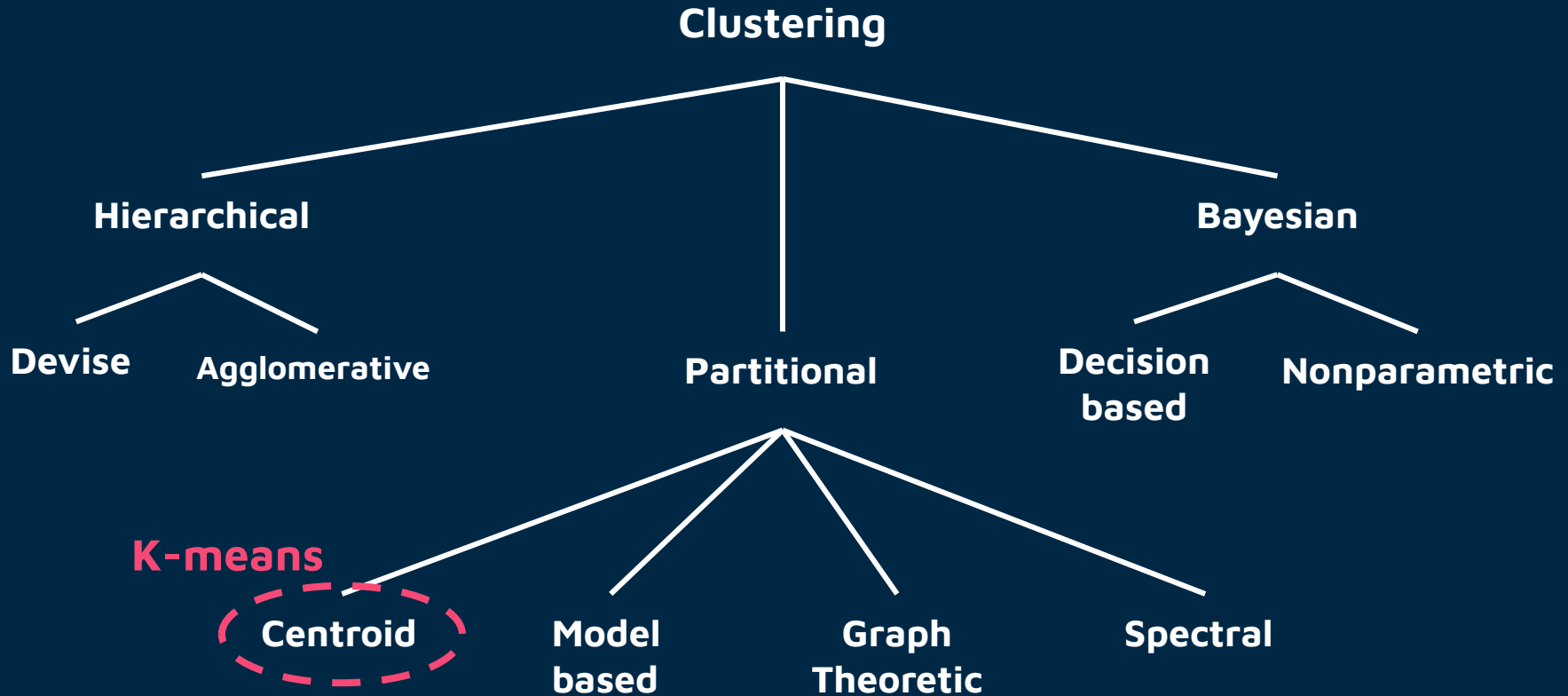
Iterate over data to optimize the criterion function



# Clustering techniques



# Clustering techniques



# K-means

**Partitioning** the given data into **k clusters** :

- Each **cluster** has a cluster center, called **centroid**.
- Centroid is the mean point of the cluster.
- **K** is the **clusters number** specified by the user.

# K-means

**Partitioning** the given data into **k clusters** :

- Each **cluster** has a cluster center, called **centroid**.
- **Centroid** is the **mean point** of a cluster.
- **K** is the **clusters number** specified by the user.

**How can we calculate the centroid of a cluster ?**

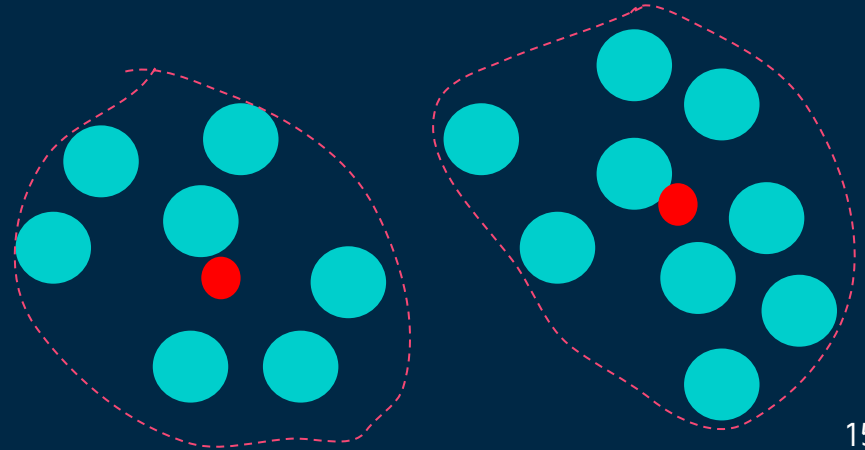
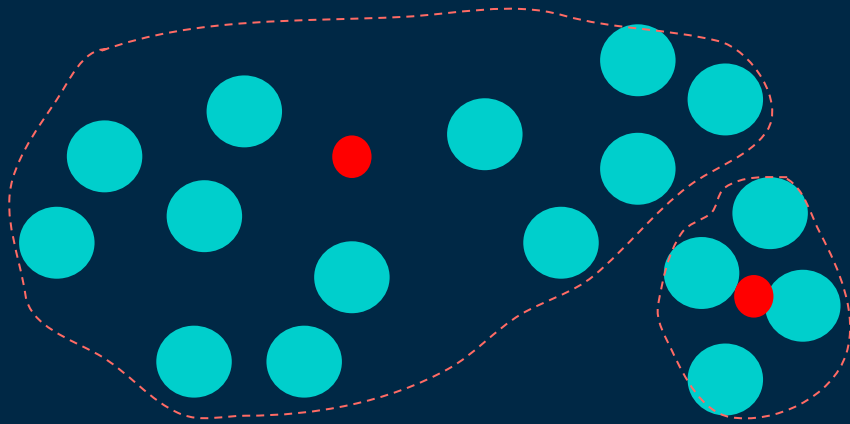
# K-means

Sum of Squared Error (**SSE**)

$$SSE = \sum_{j=1}^k \sum_{\mathbf{x} \in C_j} d(\mathbf{x}, \mathbf{m}_j)^2$$

1. **C<sub>j</sub>** is the cluster number j.
2. **m<sub>j</sub>** the **centroid** of cluster C<sub>j</sub>.
3. **d(x,y)** is the **distance** between x and y.

# K-means



# K-means

**Partitioning** the given data into **k clusters** :

1. Choose **k (random)** data **points** as the **initial centroids**.
2. **Assign** each data point to the **closest centroid**.
3. **Re-compute** the **centroids** using the current cluster memberships.
4. Repeat 2 & 3 untill **SSE** is **minimized** or **stabilized**.

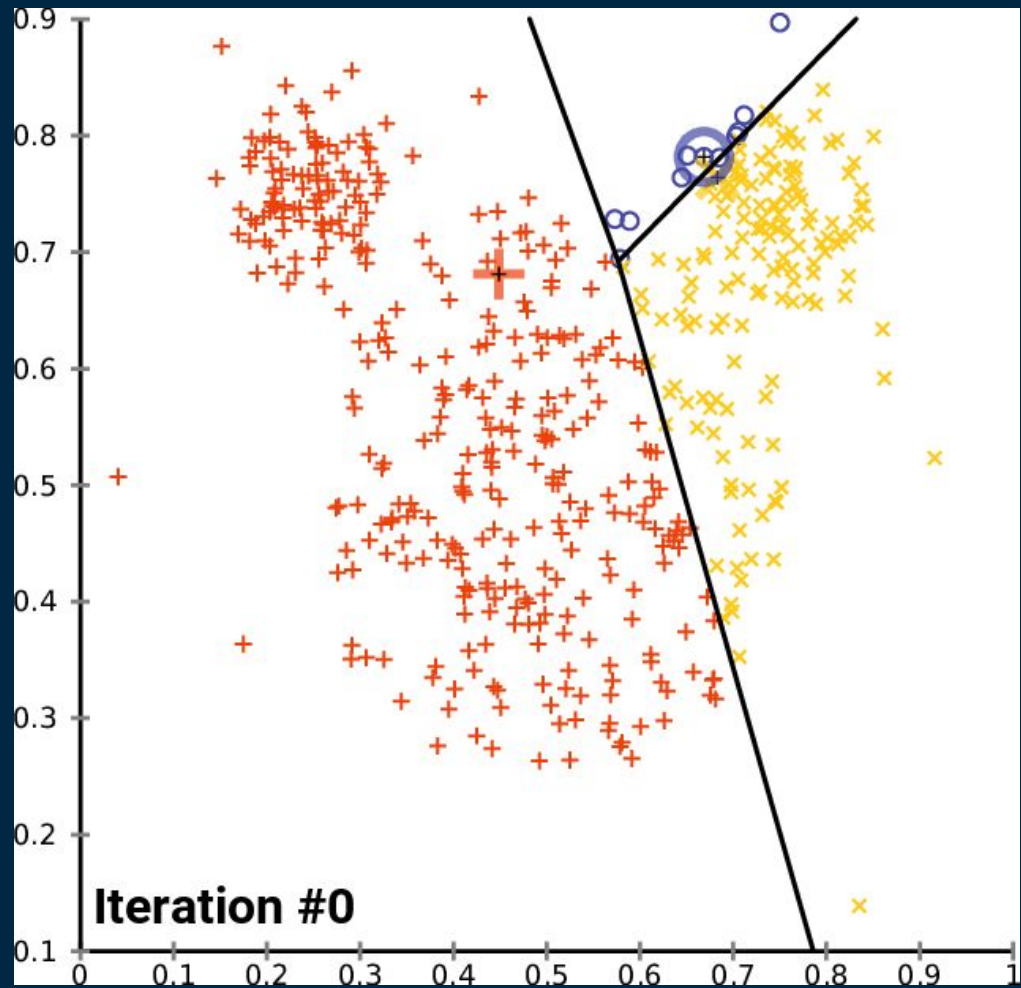


# K-means

A cluster is a :

Centroid :  $C_i$

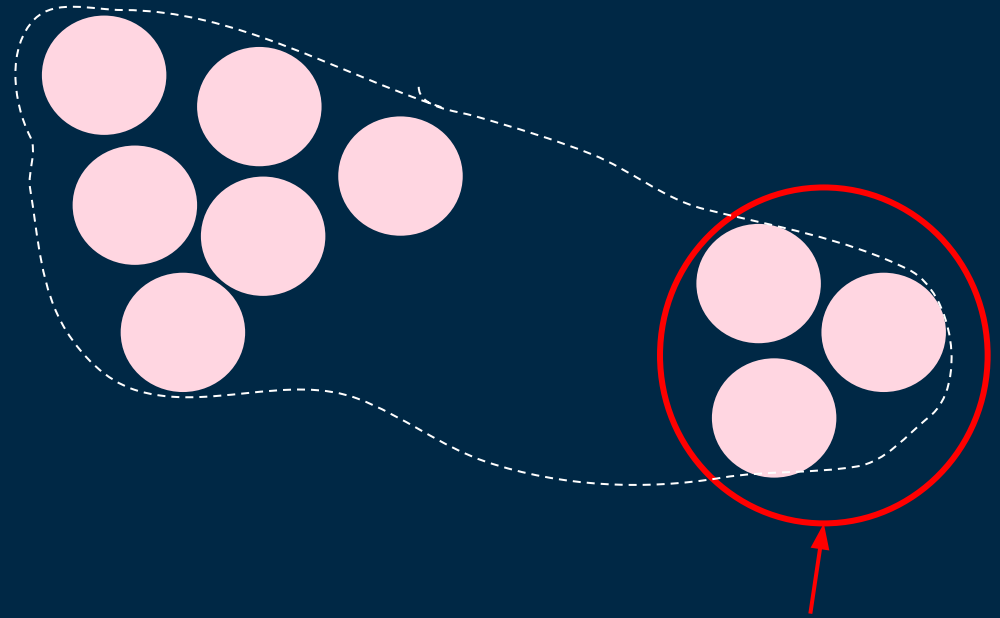
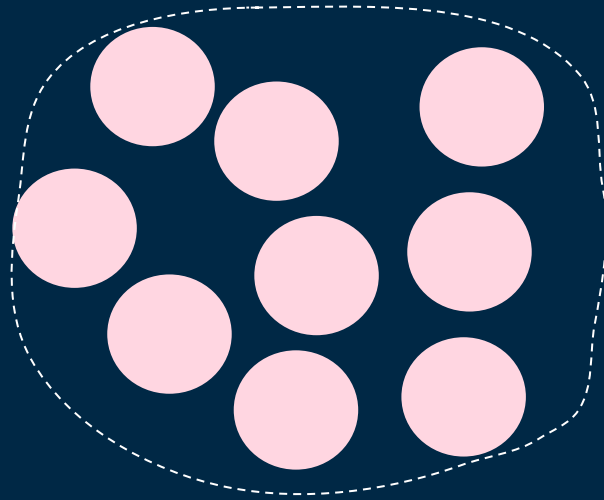
Sum of Distances  $d(C_i, X)$



# Why K-means ?

- **Simple**: easy to understand and to implement
- **Efficient** : time complexity :  $O(tkn)$  for the Euclidean distance
  - $n$  : number of points
  - $k$  : number of clusters
  - $t$  : number of iterations

Yes! ... BUT



**Outliers**

# K-means

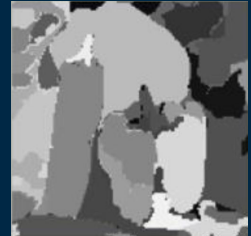
## Code Demo

Check my github Repo :

<https://github.com/Hamzandj/Open-Week-3.0>

# In a Nutshell

- **Clustering** : unsupervised machine learning.
- The clustering output can serve to **train a supervised model**.
- A good understanding of the data is mandatory.
- Results **interpretation** is a **key** to have a **good model that helps in decision making**.
- Clustering can be used to **solve complex problems**



# THANKS



[nedjari.ba.hemza@gmail.com](mailto:nedjari.ba.hemza@gmail.com)



[nedjari.ba.hemza](https://www.linkedin.com/in/nedjari.ba.hemza)

CREDITS: This presentation template was created by [Slidesgo](#), including icons by [Flaticon](#), and infographics & images by [Freepik](#)