# Exercício Clustering

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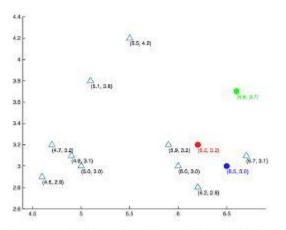


Figure 1: Scatter plot of datasets and the initialized centers of 3 clusters

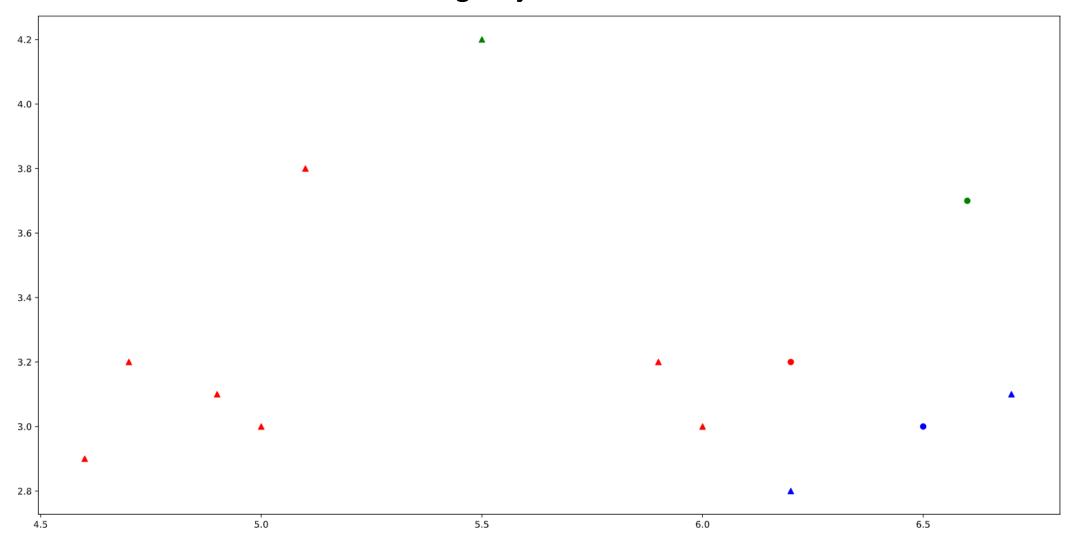
#### 1.1 Implement k-means manually

Given the matrix **X** whose rows represent different data points, you are asked to perform a k-means clustering on this dataset using the Euclidean distance as the distance function. Here k is chosen as 3. The Euclidean distance d between a vector **x** and a vector **y** both in  $\mathcal{R}^p$  is defined as  $d = \sqrt{\sum_{i=1}^p (x_i - y_i)^2}$ . All data in **X** were plotted in Figure 1. The centers of 3 clusters were initialized as  $\mu_1 = (6.2, 3.2)$  (red),  $\mu_2 = (6.6, 3.7)$  (green),  $\mu_3 = (6.5, 3.0)$  (blue).

X = [5.9 3.2] 4.6 2.9 6.2 2.8 4.7 3.2 5.5 4.2 5.0 3.0 4.9 3.1 6.7 3.1 5.1 3.8 6.0 3.0

- What's the center of the first cluster (red) after one iteration? (Answer in the format of [x1, x2], round your results to three decimal places, same as problems 2 and 3)
- 2. What's the center of the second cluster (green) after two iteration?
- What's the center of the third cluster (blue) when the clustering converges?
- 4. How many iterations are required for the clusters to converge?

## Configuração inicial

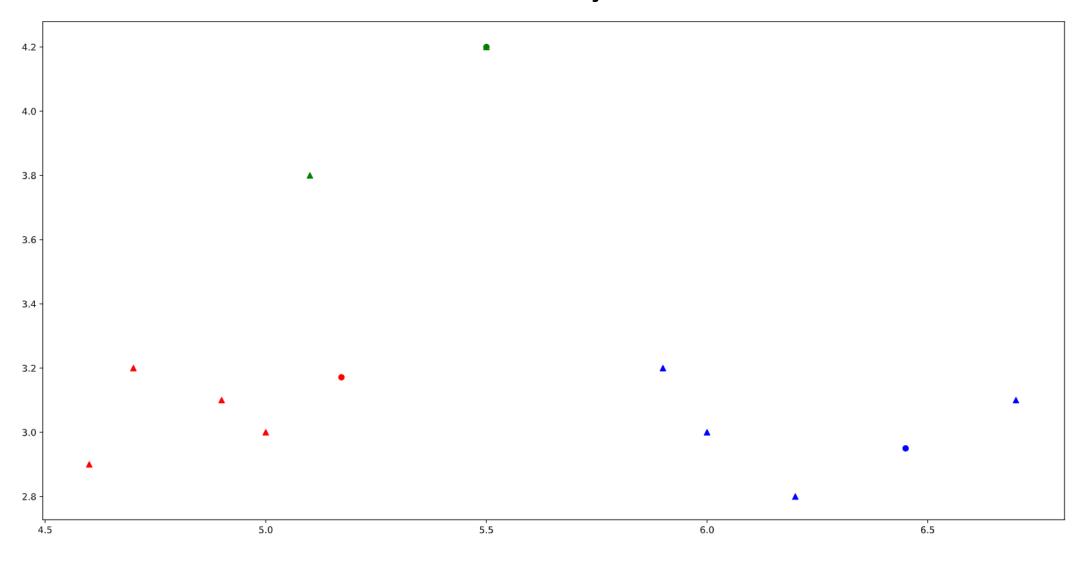


Red cluster = (6.2,3.2)

Green cluster = (6.6,3.7)

Blue cluster = (6.5,3.0)

#### Primeira iteração

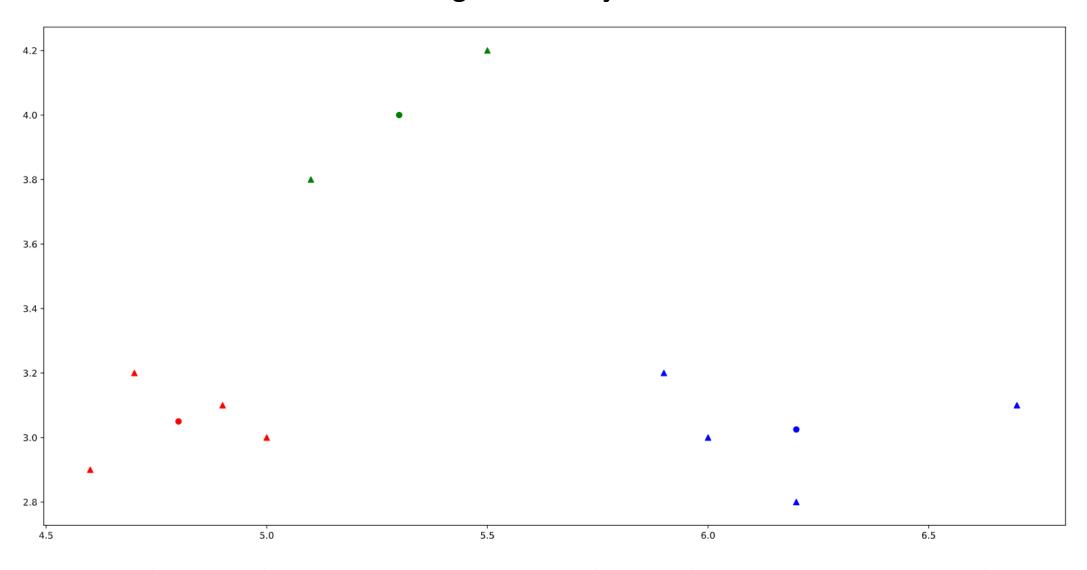


Red cluster = (5.17,3.17)

Green cluster = (5.5,4.2)

Blue cluster = (6.45, 2.95)

## Segunda iteração



Red cluster = (4.8, 3.05)

Green cluster = (5.3,4.0)

Blue cluster = (6.2, 3.025)

A partir da terceira iteração os clusters não mudam de lugar, dessa forma podemos concluir que são necessárias duas iterações para convergência

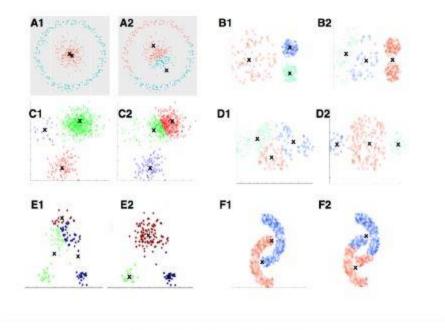


Figure 2: Clustered results for 6 datasets

is more likely to be generated by K-means method. (Hint: check the state when K-means converges; Centers for each cluster have been noted as  $\mathbf{X}$ ; Since x and y axis are scaled proportionally, you can determine the distance to centers geometrically). The distance measure used here is the Euclidean distance.

- Dataset A (write A1 or A2, same in the following question);
- 2. Dataset B
- 3. Dataset C
- 4. Dataset D
- Dataset E
- 6. Dataset F

Devemos descartar todos os casos em que há uma separação não linear, logo:

A - A2

B - B2

C - C2

D - D1

E - E2

F - F2

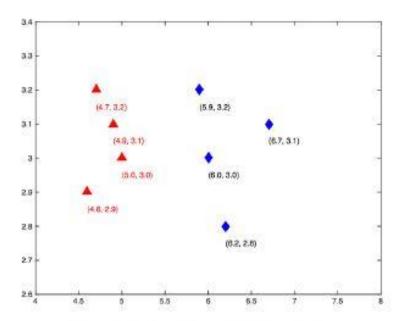


Figure 3: Scatter plot samples in two clusters

#### 1.3 Hierarchical clustering

In Figure 3 there are two clusters A (red) and B (blue), each has four members and plotted in Figure 3.

The coordinates of each member are labeled in the figure. Compute the distance between two clusters using Euclidean distance.

- 1. What is the distance between the two farthest members? (complete link) (round to **four** decimal places here, and next 2 problems);
- 2. What is the distance between the two closest members? (single link)
- 3. What is the average distance between all pairs?
- 4. Among all three distances above, which one is robust to noise? Answer either "complete", "single", or "average".

- 1. Distância dos dois membros mais distantes: euclidianDistante([4.6,2.9],[6.7,3.1]) =2.1095
- 2. Distância dos dois membros mais próximos : euclidianDistante([5.0,3.0],[5.9,3.2]) =0.9219
  - 3. Distância média de todos os pares avgEuclidianDistance = 1.4128

4. O método "average" é mais robusto à ruídos, tendo em vista que mais pontos são considerados e os "outliers" que poderiam estar muito próximos ou distantes tem seu efeito reduzido