

## Instructions

Please submit your solution **by the beginning of the week 7 lecture (9:30 AM PT, Feb 16)**. Submissions should be made on **gradescope**. Please complete homework **individually**. Please include the code of your solutions in the submission with a write-up describing how to run the code.

**You are allowed to use any third-party libraries.**

You will need the following files for this Homework:

**Iris.csv (available on canvas)**

### 1. DBSCAN Algorithm (10 points):

Consider the following figure:

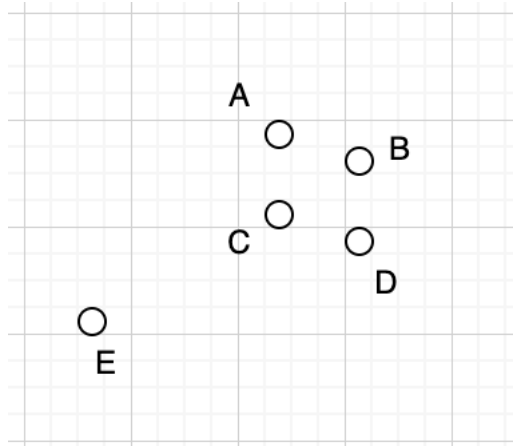


Figure 1: Points

There are 5 points: A, B, C, D, E. The distance matrix between these points is as follows:

|   | A | B | C | D | E |
|---|---|---|---|---|---|
| A | 0 | 2 | 2 | 5 | 6 |
| B | 2 | 0 | 2 | 3 | 7 |
| C | 2 | 2 | 0 | 3 | 6 |
| D | 5 | 3 | 3 | 0 | 7 |
| E | 6 | 7 | 6 | 7 | 0 |

Table 1: Distance matrix

If we cluster the above points using the DBSCAN algorithm with  $\epsilon = 4$  and **minimum points** = 3,

- (5 points) How many clusters are formed? Draw the outline of your clusters. Explain your reasoning.
- (5 points) With respect to the above figure, state one advantage of DBSCAN over k-means algorithm.

2. **Association Rule Mining (20 points):** Consider the following table:

| Id | Movies watched   |
|----|--|
| 1  | Titanic, A star is born, Crazy Rich Asians                     |
| 2  | Titanic, Inception, Crazy Rich Asians                          |
| 3  | Titanic, Crazy Rich Asians, Avatar, Iron Man                   |
| 4  | A star is born, Inception, Crazy Rich Asians, Avengers         |
| 5  | A star is born, Inception, Crazy Rich Asians, Avatar, Avengers |

Table 2: Movies

- (a) (10 points) Find all frequent patterns (i.e., movie combinations) whose support  $\geq 0.5$ .
- (b) (10 points) Find all the rules ( $X \rightarrow Y$ ) ( $s, c$ ) where  $s$  represents support and  $c$  represents confidence such that  $s \geq 0.5, c \geq 0.6$ .
3. **PCA (20 points):** Consider the following two plots. These are plots of training data points  $X$  in  $\mathbb{R}^2$  belonging to 2 classes.

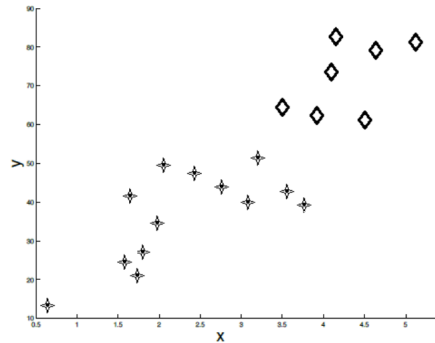


Figure 2: Dataset-1

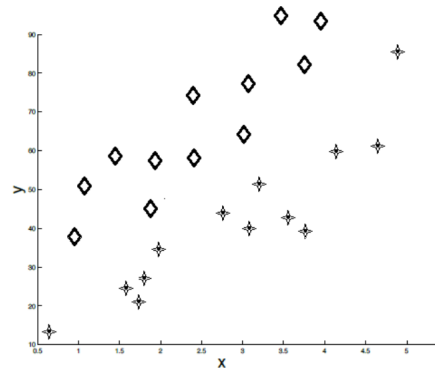


Figure 3: Dataset-2

Answer the following questions for each dataset.

- (a) (10 points) Draw all two principal components in the picture (you can take a screenshot). You are expected to draw the rough directions of the principal components instead of accurate computations.
- (b) (10 points) After projecting all the points onto one of the principal components, is it possible to correctly classify all the points by just a threshold function? If yes, which principal component should we project onto and why? If no, please explain your reasoning.

#### 4. PCA, k-Means and GMM clustering (50 points):

In this question, we will use the Iris dataset to predict **Species** of the iris plant. ('Iris.csv' in Canvas)

- (a) (5 points) In the data preparation step do the following:
  - (i) Split data into features (X) and label (y). Our label is the column **Species** and features include all the other columns except **Species** and **Id**.
  - (ii) Standardize the features (X\_standardized) by removing the mean (i.e mean=0) and scaling to unit variance. (Hint: use `sklearn.preprocessing.StandardScaler()`)
- (b) (15 points) Project the 4-dimensional standardized data (X\_standardized) onto 2 dimensions using PCA (`sklearn.decomposition.PCA()`). Visualize the scatterplot of the first two principal components of the data. In the scatterplot assign each data point a color based on its species with the following dictionary:  

```
{ 'Iris-setosa': 'r', 'Iris-versicolor': 'g', 'Iris-virginica': 'b' }.
```
- (c) (10 points) Cluster the standardized data (X\_standardized) into 3 clusters using GMM clustering. Score the clustering accuracy with `sklearn.metrics.cluster.adjusted_rand_score()`. (Hint: use `sklearn.mixture.GaussianMixture()`)
- (d) (10 points) Cluster the standardized data (X\_standardized) into 3 clusters using K-means clustering. Score the clustering accuracy with `sklearn.metrics.cluster.adjusted_rand_score()`. (Hint: use `sklearn.cluster.KMeans()`)
- (e) (10 points) Briefly compare the result from part (c) and part (d). Explain why Gaussian Mixture algorithm performs better than k-Means algorithm.

Suggested reading: [http://scikit-learn.org/stable/modules/generated/sklearn.metrics.adjusted\\_rand\\_score.html](http://scikit-learn.org/stable/modules/generated/sklearn.metrics.adjusted_rand_score.html)