

**Instructions**

- This homework assignment is worth 73 points.
- Please submit a **.ipynb** file to Blackboard.
- **Please strive for clarity and organization.**
- **Due Date: November 17, 2023 by 11:59 pm.**

**Exercise 1**

(5 points) Why feature scaling is important for the  $k$ -means algorithm? Be specific.

**Exercise 2**

(5 points) How can clustering be used to improve the performance of a linear model?

- (a) Creating different models for different cluster groups.
- (b) Creating an input feature for cluster ids as dummy variables.
- (c) Creating an input feature for cluster centroids as a continuous variable.
- (d) Creating an input feature for cluster size as a continuous variable.
- (e) All of the above.
- (f) None of the above.

**Exercise 3**

(5 points) What are the risks of initial random cluster centroids assignments in  $k$ -means? Be specific.

**Exercise 4**

Consider the `Mall_Customers.csv` data file. This file contains the basic information (ID, age, gender, income, spending score) about a mall customers in the US. **In Python**, answer the following:

- (a) (5 points) Using the pandas library, read the csv data file and create a data-frame called `customers`. Remove the observations with missing values (if there is missing values).
- (b) (8 points) Using the appropriate Python commands, put `Gender`, `Age` and `Annual Income (k$)` in the same scale.

- (c) (30 points) Because you are not familiar enough with buying patterns in malls, estimate the number of clusters for this dataset using the Calinski-Harabasz, Davies-Bouldin, and Silhouette scores. Do the following:
- Using **Gender**, **Age** and **Annual Income (k\$)** cluster that data into clusters ( $k = 2, 3, \dots, 9, 10$ ). Use `n_init = 20`.
  - For each clustering results, compute the Calinski-Harabasz, Davies-Bouldin, and Silhouette scores.
  - Visualize the Calinski-Harabasz, Davies-Bouldin, and Silhouette scores.
  - Estimate the number of clusters.
- (d) (8 points) Using the results from part (c), cluster the data into that number of clusters (use `n_init = 20`).
- (e) (7 points) Describe each of the clusters. Does the clustering results make sense? if not, suggest how would improve this analysis.