

Homework 2

Due: Tuesday 10/15, 11:55pm on Titanium. Prepare your answers as a single PDF file.

Group work: You may work in groups of 1-3. Include all group member names in the PDF file. Only one person in the group needs to submit to Titanium.

1. Consider the “Auto MPG” which “concerns city-cycle fuel consumption in miles per gallon, to be predicted in terms of 3 multivalued discrete and 5 continuous attributes.”¹ The goal is to model mpg given engine displacement and number of cylinders. Answer the following questions.

- a. Load the `autompg.csv` file on Titanium and convert cylinders variable to a factor. (code, output of `str()`)
- b. Which is the dependent variable? Which are the independent variables?
- c. Plot `mpg` vs. `displacement` (code, plot)
- d. Create a linear model of `mpg` vs. `displacement` (only one independent variable). What is the R^2 ? (code, output of `summary(model)`, R^2 value)
- e. Create a new transformed variable that is `sqrt(displacement)`. Create a linear model of `mpg` vs. `log(displacement)`.
 - i. Give R code, output of `summary(model)`
 - ii. Is this a better fit than in part (d)?
 - iii. Plot `mpg` vs. `sqrt(displacement)` and overlay the best fit model as a straight line. (code, plot)
 - iv. Plot `mpg` vs. `displacement` and overlay the best fit model as a curve. (code, plot) [Hint: plot the predictions; use `add_predictions()` and `geom_line()`. You don't have to use `data_grid()`]
- f. Create a linear model of `mpg` vs. `sqrt(displacement)` and `cylinders`.
 - i. Give R code, output of `summary(model)`
 - ii. How many dummy (i.e., 0-1) variables were created in the model?
 - iii. Is this a better fit than in part (e)?
 - iv. Plot `mpg` vs. `sqrt(displacement)` and overlay the **multiple** linear fit lines: one for each value of the discrete variable. (code, plot)
 - v. Plot `mpg` vs. `displacement` and overlay the best fit model as a curve. (code, plot) [Hint: plot the predictions; use `add_predictions()` and `geom_line()` and use the color aesthetic for cylinders]

¹Dataset modified from UC Irvine ML repository <https://archive.ics.uci.edu/ml/datasets/Auto+MPG>. This is *not* the mpg data that is part of the tidyverse datasets.

2. Consider the toy dataset below which shows if 4 subjects have diabetes or not, along with two diagnostic measurements. [This question is meant to be completed with a calculator; no need to write any R code.]

| Preg | BP | HasDiabetes | Preg.Norm | BP.Norm |
|------|----|-------------|-----------|---------|
| 2 | 74 | No | | |
| 3 | 58 | Yes | | |
| 2 | 58 | Yes | | |
| 1 | 54 | No | | |
| 2 | 70 | ? | | |

- Which variable is the “Class” variable?
- Normalize the Preg and BP values by scaling the minimum-maximum range of each column to 0-1. Fill in the empty columns in the table.
- Predict whether a subject with Preg=2, BP=70 will have diabetes using the 1-NN algorithm and
 - Using Euclidean distance on the original variables:
 - Using Manhattan distance on the original variables:
 - Using Euclidean distance on the normalized variables:
 - Using Manhattan distance on the normalized variables:

3. The `data_banknote_authentication.csv` file attached on Titanium contains instances of genuine and forged banknotes. The first four columns are features calculated from an industrial camera²; the fifth column indicates if the banknote is forged or not. The goal is to see if it is possible to detect a forgery from only the features.

- Load and pre-process the data. Show code to:
 - Load the data file on Titanium.
 - How many rows and columns are there?
- Split the dataset into train and test datasets with the *rows 1, 3, 5, ...* for training, and the remaining rows for test (i.e, test using rows 2, 4, 6, ...). Do **NOT** randomly sample the data (though resampling is usually done, this hw problem does not use this step for ease of grading). (code)
- Train and test a k-nearest neighbor classifier with the above datasets. *Consider only variance and skewness columns*. Set k=1. What is the error rate (number of misclassifications)? (code)

²For further information, refer to: <https://archive.ics.uci.edu/ml/datasets/banknote+authentication>

- d. Repeat part (c) but *consider only variance , skewness, and curtosis columns*. Set $k=1$. (show code.) What is the error rate? Will the error rate always decrease with larger number of parameters? Why or why not: answer in 2-3 sentences?
- e. Repeat part (d) but set $k=5$. What is the error rate?
- f. Repeat part (e) but set $k=11$. What is the error rate? Considering your observations from (d)-(f), which is the best value for k ?
- g. Consider only the ranges of the features - is normalization required?
- h. Normalize each column by scaling the minimum-maximum range of each column to 0-1. (Hint: the built-in R function `scale()` can be used for this) (code)
- i. Train and test a k-nearest neighbor classifier with the normalized dataset. *Consider only variance, skewness, and curtosis columns*. Set $k=1$. What is the error rate?