```
# Roll no. 33235
# Batch: L10
# P.S.: Application of Linear regression and KNN on Heart disease dataset to
        predict the fate (prob. of heart disease)
> # Read the CSV file and analyse
> hdata <- read.csv(file.choose()header=TRUE, sep=",")</pre>
[1] "x63.0" "x1.0" "x1.0.1" "x145.0" "x233.0" "x1.0.2" "x2.0" "x150.0" "x0.0" "x0.0" [14] "x0"
> names(hdata)
> str(hdata)
'data.frame':
                 302 obs. of 14 variables: 67 67 37 41 56 62 57 63 53 57 ...
  $ x63.0 : num
         : num
                  1 1 1 0 1 0 0 1
  $ X1.0
                                      11...
                  4 4 3 2 2 4 4 4 44...

160 120 130 130 120 140 120 130 140 140 ...

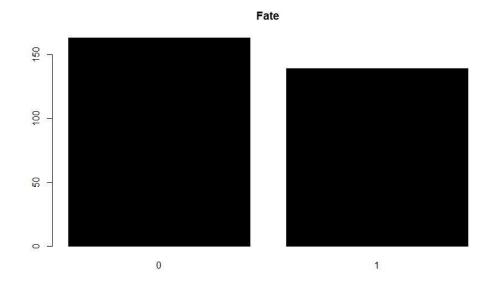
286 229 250 204 236 268 354 254 203 192 ...
                                      44..
  $ x1.0.1: num
  $ x145.0: num
  $ x233.0: num
                  0 0 0 0 0 0 0
  $ x1.0.2: num
                                      10...
                  2 2 0 2 0 2 0 2
  $ x2.0
         : num
                                      20..
                  108 129 187 172 178 160 163 147 155 148 ...
  $ x150.0: num
                  1 1 0 0 0 0 1 0
                                     10..
  $ x0.0 : num
  $ x2.3 : num
                  1.5 2.6 3.5 1.4 0.8 3.6 0.6 1.4 3.1 0.4 ...
  $ x3.0 : num
                                                                          22...
 $ x6.0
 $ X0
> dim(hdata)
[1] 302 14
```

> # Change the headers

```
> names(hdata)[1] <- "age"</pre>
  names(hdata)[2] <- "sex"</pre>
  names(hdata)[3] <- "cp"</pre>
  names(hdata)[4] <- "trestbps"</pre>
 names(hdata)[5] <- "chol"</pre>
  names(hdata)[6] <- "fbs"</pre>
> names(hdata)[7] <- "restecg"</pre>
> names(hdata)[8] <- "thalach"</pre>
> names(hdata)[9] <- "exang"</pre>
> names(hdata)[10] <- "oldpeak"</pre>
  names(hdata)[11] <- "slope"</pre>
  names(hdata)[12] <- "ca"</pre>
  names(hdata)[13] <- "thal"
> names(hdata)[14] <- "num"</pre>
> hdata$ca
  0.0 0.0 2.0 2.0 0.0 0.0 0.0 0.0 0.0
 [30] 2.0 2.0 0.0 0.0 0.0 0.0 0.0 1.0 1.0 0.0 3.0 0.0 2.0 0.0 0.0 1.0 0.0 0.0 1.0 0.0
       1.0 0.0 1.0 0.0 1.0 1.0 1.0 0.0 1.0
      1.0 0.0 0.0 3.0 0.0 1.0 2.0 0.0 0.0 0.0 0.0 2.0 2.0 2.0 1.0 0.0 1.0 1.0 0.0
 [59]
       0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0
 [88] \quad 0.0 \quad 0.0 \quad 0.0 \quad 3.0 \quad 3.0 \quad 0.0 \quad 0.0 \quad 1.0 \quad 1.0 \quad 2.0 \quad 1.0 \quad 0.0 \quad 0.0 \quad 0.0 \quad 1.0 \quad 1.0 \quad 3.0 \quad 0.0 \quad 1.0 \quad 1.0
       1.0 0.0 0.0 1.0 0.0 0.0 1.0 0.0 0.0
[117] 0.0 3.0 1.0 2.0 3.0 0.0 0.0 1.0 0.0 2.0 1.0 0.0 0.0 0.0 1.0 0.0 0.0 0.0 0.0
       1.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0
      3.0 0.0 0.0 1.0 0.0 0.0 0.0 1.0 1.0 3.0 0.0 2.0 2.0 1.0 0.0 3.0 0.0 0.0 2.0 0.0
[146]
       1.0 1.0 0.0 0.0 1.0 0.0 0.0 0.0 2.0
      1.0 3.0 1.0 1.0 3.0 0.0 2.0 2.0 0.0 0.0 2.0 0.0 3.0 1.0 3.0 0.0 3.0 2.0 3.0 0.0
       2.0 1.0 0.0 0.0 0.0 0.0 0.0 1.0 0.0
[204] 0.0 3.0 2.0 0.0 0.0 0.0 0.0 0.0 2.0 1.0 0.0 0.0 0.0 2.0 0.0 0.0 0.0 2.0
       2.0 0.0 0.0 1.0 1.0 1.0 0.0 0.0 3.0
[233]
      1.0 1.0 2.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 2.0 0.0 1.0 1.0 2.0 0.0 0.0 1.0 1.0
       0.0 0.0 0.0 2.0 0.0 0.0 0.0 1.0 2.0
[262] 0.0 0.0 1.0 0.0 0.0 1.0 0.0 0.0 1.0 0.0 2.0 0.0 2.0 0.0 1.0 0.0 1.0 0.0 1.0 0.0
       1.0 0.0 1.0 3.0 2.0 ?
                                 0.0 0.0 0.0
[291] 0.0 0.0 2.0 0.0 0.0 2.0 0.0 0.0 2.0 1.0 1.0
? Levels: ? 0.0 1.0 2.0 3.0
> levels(hdata$ca)[levels(hdata$ca) == "?"]<-"0.0"</pre>
 hdata
    age sex cp trestbps chol fbs restecg thalach exang oldpeak slope ca thal num
     67
           1
              4
                      160
                            286
                                  0
                                                  108
                                                                  1.5
                                                                             3.0
                                                                                   3.0
2
3
           1
                                                                  2.6
                                                                             2.0
              4
                      120
                            229
                                  0
                                                  129
                                                           1
                                                                                   7.0
                                                                                         1
     67
           1
                                           0
                                                           0
                                                                           3
     37
              3
                      130
                            250
                                  0
                                                  187
                                                                  3.5
                                                                             0.0
                                                                                         0
                                                                                   3.0
4
5
6
           0
              2
                                           2
                                                           0
                                                                           1
                                                                                         0
     41
                      130
                            204
                                  0
                                                  172
                                                                  1.4
                                                                             0.0
                                                                                   3.0
     56
           1
              2
                      120
                            236
                                  0
                                           0
                                                   178
                                                           0
                                                                  0.8
                                                                           1
                                                                             0.0
                                                                                   3.0
3.0
                                                                                         0
     62
57
                                                                           3
                                                                             2.0
           0
              4
                      140
                            268
                                  0
                                                   160
                                                           0
                                                                  3.6
                                                                                         3
                                  0
                                                                                   3.0
              4
                                                                  0.6
                                                                           1
                                                                             0.0
                                                                                         0
           0
                      120
                            354
                                                           1
                                                  163
```

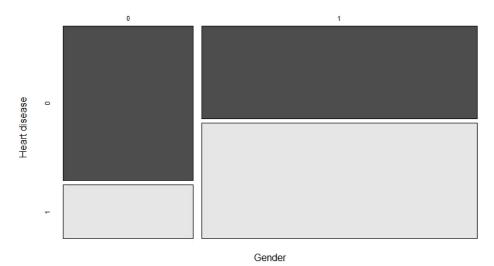
89 101 112 113 114 115 116 117 118 119 119 119 119 119 119 119 119 119
1110111111011101110001110111111111101010
130 140 140 140 130 172 150 110 130 130 120 130 120 150 140 150 140 150 140 150 140 150 140 150 140 150 140 150 150 140 150 150 150 150 150 150 150 150 150 15
221222211222222222222222322212232221232221241112222222312231
010010100000010000000010000001000010000110000
220220000002222200000000220020002200220022002200220000
147 158 158 160 171 160 173 160 173 161 161 163 163 163 164 165 165 165 165 165 165 165 165 165 165
010010000001000010100101011110100000000
130100011110011113210212111000002011111010202010000120000111120123133000
1.0 2.0 2.0 2.0 2.0 2.0 2.0 2.0 2
$\begin{array}{c} 7.00\\ 0.00\\$
21002000100000134000003021000031304000014040000201111100201022102103

```
[ reached 'max' / getOption("max.print") -- omitted 231 rows ]
> hdata$ca[hdata$ca ==
1.0] factor(0)
Levels: 0.0 1.0 2.0 3.0
> typeof(hdata$ca)
[1] "integer"
> nrow(hdata)
[1] 302
> # Plotting Fate vs number of records
> hdata$num[hdata$num >= 1] <- 1 # Edit the fate to 0 and 1
> barplot(table(hdata$num), main="Fate", col="black")
```



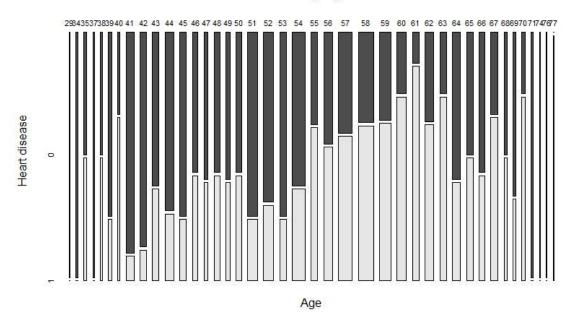
- > # Plot Fate vs gender
- > mosaicplot(hdata\$sex ~ hdata\$num,main="Fate by Gender",
 + shade=FALSE,color=TRUE,xlab="Gender", ylab="Heart disease")

Fate by Gender



- > # Plot Fate vs Age
- > mosaicplot(hdata\$age ~ hdata\$num,main="Fate by Age",
 + shade=FALSE,color=TRUE,xlab="Age", ylab="Heart disease")

Fate by Age



- > # Most important step, change the values of NA
- levels(hdata\$thal)[levels(hdata\$thal)=="?"]<-"3.0"</pre>
- > # removal of additional NA

```
> hdata$tha1
  [1] 3.0 7.0 3.0 3.0 3.0 3.0 3.0 7.0 7.0 6.0 3.0 6.0 7.0 7.0 3.0 7.0 3.0 3.0 3.0 3.0
      3.0 3.0 7.0 7.0 3.0 3.0 3.0 3.0 7.0
      [59] 3.0 7.0 3.0 7.0 3.0 7.0 7.0 3.0 7.0 7.0 3.0 3.0 7.0 7.0 6.0 3.0 3.0 7.0 3.0
      7.0 3.0 3.0 3.0 7.0 3.0 3.0 3.0 3.0
     3.0 3.0 3.0 7.0 7.0 3.0 3.0 7.0 7.0 7.0 3.0 3.0 3.0 3.0 3.0 3.0 7.0 7.0 7.0
 Γ88٦
      7.0 7.0 7.0 3.0 6.0 7.0 7.0 6.0 3.0
[117] 3.0 7.0 7.0 7.0 7.0 3.0 7.0 3.0 3.0 7.0 7.0 3.0 3.0 7.0 7.0 3.0 3.0 3.0 3.0 7.0
      7.0 7.0 3.0 3.0 7.0 3.0 7.0 7.0 3.0
[146] 7.0 3.0 3.0 3.0 7.0 3.0 7.0 7.0 3.0 3.0 7.0 7.0 7.0 7.0 7.0 3.0 3.0 3.0 3.0 7.0
      3.0 3.0 7.0 3.0 7.0 7.0 3.0 3.0 6.0
[175] 7.0 7.0 6.0 3.0 3.0 7.0 7.0 3.0 7.0 3.0 3.0 7.0 6.0 7.0 7.0 3.0 7.0 3.0 3.0
         3.0 3.0 3.0 3.0 3.0 3.0 7.0 7.0
      3.0
[204] 7.0 7.0 7.0 7.0 3.0 3.0 3.0 7.0 3.0 7.0 3.0 7.0 3.0 3.0 3.0 3.0 3.0 3.0 3.0 7.0
      3.0 3.0 3.0 3.0 3.0 3.0 3.0 3.0
[233] 3.0 3.0 3.0 7.0 7.0 3.0 3.0 3.0 3.0 3.0 3.0 3.0 7.0 3.0 7.0 3.0 6.0 7.0 7.0
      3.0 3.0 3.0 3.0 3.0 3.0 7.0 3.0 3.0
[262] 3.0 3.0 3.0 6.0 3.0 6.0 7.0 3.0 7.0 6.0 7.0 3.0 3.0 7.0 3.0 3.0 3.0 3.0 7.0 3.0
      7.0 3.0 7.0 6.0 6.0 7.0 7.0 3.0 7.0
[291] 3.0 6.0 7.0 3.0 3.0 6.0 7.0 7.0 7.0 7.0 3.0
3.0 Levels: 3.0 6.0 7.0
> table(hdata$thal)
3.0 6.0 7.0
168 17 117
> table(hdata$ca)
0.0 1.0 2.0 3.0
179 65 38
> library(caTools) # import library
caTools Warning message:
package 'caTools' was built under R version 3.6.3
> n<- sapply(hdata[, c(1)], mean) # get the average values
> set.seed(123) # generate a pseudo-random number
> v3 <- hdata[c(11:14),c(2,7:9)]</pre>
> v3
  sex restecg thalach exang 0 2 153 0
11
              2
12
                    142
      1
                           1
13
      1
             0
                    173
                           0
14
                    162
                           0
> m<- sapply(v3,max)</pre>
> m
            sex restecg
                          exang
          thalach 12173
> set.seed(121)
> # Divide the dataset into 2/3 for training, and 1/3 for testing
```

> split = sample.split(hdata\$num, SplitRatio = 2/3)

```
> train_hdata = subset(hdata, split == TRUE)
> test_hdata = subset(hdata, split == FALSE)
 # Apply linear regression for Fate vs age
> regressor=lm(formula = num~age, data=train_hdata)
> View(regressor)
> regressor
call:
lm(formula = num ~ age. data = train hdata)
Coefficients:
(Intercept)
                      age
   -0.33038
                  0.01453
> # Apply regression on test data
> hd_age_predict = predict(regressor, newdata=test_hdata)
> hd_age_predict
                                                    10
                                                              18
                                                                         19
                                                                                    20
  25
             29
                       30
                                  31
 0.6430055 0.2652722 0.4977234 0.5848927 0.4977234 0.3669696 0.3814978 0.5994209
 0.3960260 0.2507440 0.6720619 0.5413081
                                                    45
                                                              47
                                                                         52
                   34
                              42
 61
                                 70
 0.5267799 0.3088568 0.7011183 0.5267799 0.5122517 0.3960260 0.3088568 0.4105542
 0.3379132 0.5413081 0.5267799 0.6139491
        73
                   75
                             78
                                                    83
                                                              84
       108
                  109
                             110
                                        111
 0.6139491 0.6139491 0.3669696 0.5122517 0.6575337 0.4250824 0.3088568 0.3524414
 0.5558363 0.2362158 0.5558363 0.4831952
                                        129
                                                  134
                                                             136
                  118
                             122
                                                                        137
       115
       141
                  144
                             147
                                        149
 0.2652722 0.5848927 0.4105542 0.5703645 0.2943286 0.6865901 0.5703645 0.4105542
 0.5267799 0.5122517 0.2652722 0.5413081
       155
                                                  169
                                                             173
                                                                        175
                                                                                  176
                  156
                             158
                                        168
       179
                  184
                             185
                                        186
0.6865901 0.4105542 0.5413081 0.1781030 0.3233850 0.5703645 0.4977234 0.4250824 0.4396106 0.5413081 0.5848927 0.2798004
                  192
                             194
                                                  201
                                                             204
                                                                        206
                                                                                  207
       214
                  217
                             219
                                        220
 0.6284773 0.2943286 0.6575337 0.3233850 0.5994209 0.2943286 0.5122517 0.3960260
 0.4250824 0.3379132 0.5267799 0.2652722
       225
                  226
                             229
                                        230
                                                  232
                                                             236
                                                                        237
                                                                                  240
                  247
                             248
                                        252
 0.1635748 0.3524414 0.6284773 0.4250824 0.3814978 0.4831952 0.3379132 0.2652722
 0.2652722 0.3524414 0.4250824 0.5994209
                                                             273
                                                                        276
                  258
                             262
                                                  267
                                                                                  282
                                        265
 0.2798004 \ 0.6865901 \ 0.5413081 \ 0.2798004 \ 0.5267799 \ 0.7011183 \ 0.6284773 \ 0.4686670
 0.5558363 0.5122517 0.4831952 0.3088568
       293
                  296
                             301
0.5848927 0.5267799 0.4977234 0.2216876
> # Round the values of fate in prediction
> round_age=hd_age_predict
> r=round(round_age)
```

```
8 10 18 19 20
75 78 79 83 8
                                       25
                                            29
                                                  30
                                                       31
                                                           33
                                                                34
                                                                    42
                                                                          43
                                                                               45
                                                                                    47
                                                                                        52
                                                                                             59 61
         70
              73
                                 83 84
                      0
            0
                 1
                          0
                               0
                                              0
                                                   1
                                                        1
                                                             1
                                                                  0
                                                                      1
                                                                           1
                                                                                1
                                                                                     0
                                                                                          0
                                                                                               0
                                                                                                  0
   1
                                    1
                   1
                        0
                            1
              1
                                 1
                                      0
85 86 108 109 110 111 115 118 122 129 134 136 137 139 141 144 147 149 155 156 158 168 169 173 175 176 179 184 185 186
   0 0 1 0
                      1
                          0
                               0
                                                   0
                                                        1
                                                             1
                                                                 0
                                                                      1
                                                                           1
                                                                                0
                                                                                     1
                                                                                         1
                                                                                                   1
               0
                    0
                         0
                                       0
 187 192 194 197 201 204 206 207 214 217 219 220 225 226 229 230 232 236 237 240 241 247 248 252 255 258 262 265 267 273
                0
                                              0
                                                   1
                                                        0
                                                             0
                                                                  0
                                                                      1
                                                                           0
                                                                                0
                                                                                     0
                                                                                         0
                                                                                              0
                                                                                                   0
  1 0 1
                      1
                               1 0
                    1
                        1
                             0
 276 282 284 285 288 292 293 296 301 302
> table(r,test_hdata$num)
     0
  03420
  12026
> library(e1071)
> library(caret)
> typeof(r)
[1] "double"
> levels(r)
NULL
> levels(test_hdata$num)
NULL
> str(r)
 - attr(*, "names")= chr [1:100] "2" "4" "7" "8" ...
> r1 = as.data.frame(r)
 r1
>
2
4
7
8
10
    0
    0
    1
    0
18
    0
19
20
25
29
30
    0
    1
```

```
255 0
 258 1
 262 1
 265 0
 267
 273 1
 276
 282 0
 284 1
 285 1
 288 0
 292 0
 293 1
 296 1
 301 0
 302 0
 > df1=confusionMatrix(as.factor(r1$r),as.factor(test_hdata$num))
 > df1
 Confusion Matrix and Statistics
             Reference
 Prediction 0 1 0 34 20
            1 20 26
      Accuracy: 0.6
95% CI: (0.4972, 0.6967)
No Information Rate: 0.54
      P-Value [Acc > NIR] : 0.1347
                        Kappa : 0.1948
   Mcnemar's Test P-Value: 1.0000
            Sensitivity: 0.6296
Specificity: 0.5652
Pos Pred Value: 0.6296
Neg Pred Value: 0.5652
                 Prevalence: 0.5400
            Detection Rate: 0.3400
     Detection Prevalence: 0.5400
         Balanced Accuracy: 0.5974
          'Positive' Class: 0
>> library(caTools)
> hdata[, c(1)] <- sapply(hdata[, c(1)], as.numeric)</pre>
> set seed(123)
> split = sample.split(hdata$num, SplitRatio = 2/3)
> train_hdata = subset(hdata, split == TRUE)
> test_hdata = subset(hdata, split == FALSE)
> library(caTools)
> #regressor=lm(formula = num~age, data=train_hdata)
> #regressor=lm(formula =
num~age+sex+cp+trestbps+chol+fbs+restecg+thalach+exang+oldpeak+slope,data=tra
in_hdata)
```

```
> hd_age_predict=predict(regressor, newdata=test_hdata)
> hd_age_predict
2
                              9
                                                  18
                                                             19
                                                                       22
                                       11
0.6407102 0.5828263 0.4381165 0.4815294 0.3657616 0.3802325 0.5104714 0.2499937 0.5972972
                  41
                             47
                                       48
                                                  52
                                                             54
                                                                       56
       38
0.4670584 0.2499937 0.3947035 0.6117682 0.3078776 0.5394133 0.3947035
0.4091745 0.4091745
                  63
                             68
                                       69
                                                  71
                                                             72
                                                                       76
       61
          80
0.3368196 0.4525874 0.5249423 0.3368196 0.6407102 0.5683553 0.5394133
0.4091745 0.3223486
       82
                  89
                             90
                                       94
                                                  99
                                                            102
                                                                      111
0.2355227 0.4091745 0.6262392 0.5828263 0.3657616 0.4960004 0.4815294
0.2644647 0.5828263
                           126
                                      135
                                                 140
      124
                 125
                                                            143
                                                                      146
147
          148
0.6117682 0.3223486 0.4815294 0.4670584 0.5249423 0.5972972 0.4960004
0.2644647 0.3223486
      150
                           152
                                      153
                                                 154
                                                            156
                                                                      158
                 151
0.3657616 0.4960004
                           186
                                      187
                                                 191
                                                            192
                                                                      193
      179
                 183
194
          197
0.4381165 0.5249423 0.2789357 0.6262392 0.4091745 0.2934067 0.5683553
0.6551812 0.3223486
                           202
                                      213
      200
                 201
                                                 215
                                                            219
                                                                      220
221
          222
0.3947035 0.5972972 0.4960004 0.6262392 0.4815294 0.5249423 0.2644647
0.4525874 0.2355227
                 232
                           236
                                      237
                                                 239
                                                            244
249
          250
0.1631678 0.3802325 0.4815294 0.3368196 0.2789357 0.5394133 0.3512906
0.5683553 0.4960004
                           259
                                      261
                                                 266
                                                            273
          282
281
0.2934067 0.2789357 0.4960004 0.5104714 0.4236455 0.6985941 0.5104714
0.3512906 0.4670584
                 287
                           290
                                      291
                                                 293
                                                            295
      283
          300
0.1776388 0.5104714 0.6407102 0.4670584 0.5828263 0.2644647 0.5249423
0.6551812 0.4960004
      301
0.4960004
> round_age=hd_age_predict
> rage=round(round_age)
> table(rage,test_hdata$num)
rage 0 1
0 40 24
1 14 22
> library(e1071)
> library(caret)
> str(rage)
Named num [1:100] 1 1 0 0 0 0 1 0 1 0 ...
- attr(*, "names")= chr [1:100] "2" "8" "9" "11" ...
> r1 = as.data.frame(rage)
> r1
    rage
2
```

8911892233847824696138912677778889999111184256555566638912677778029049111184111111111111111111111111111111	
150 151 152 153 154 156 158 164 165 179 183 186 187 191 192 193 194 197 200 201	0 11 0 11 0 0 0 11 0 0 0 11 0 0

```
0
1
202
213
215
        0
        10
219
220
221
222
225
232
        0
        0
        0
        0
236
237
        0
        Ŏ
239
        0
244
        1
        0
1
247
249
250
        0
254
255
        0
        0
2<sub>59</sub>
        0
261
        ō
266
        1
273
279
        0
281
        Ŏ
282
        0
283
287
        1
290
        1
291
        0
293
        1
295
        0
296
        1
299
        1
        0
300
301
> df=confusionMatrix(as.factor(r1$rage),as.factor(test_hdata$num))
> df
Confusion Matrix and Statistics
            Reference
Prediction 0 1
          0 40 24
1 14 22
                 Accuracy: 0.62
95% CI: (0.5175, 0.7152)
    No Information Rate: 0.54
    P-Value [Acc > NIR] : 0.06554
                     Kappa: 0.2226
 Mcnemar's Test P-Value: 0.14429
              Sensitivity: 0.7407
Specificity: 0.4783
          Pos Pred Value : 0.6250
          Neg Pred Value: 0.6111
               Prevalence: 0.5400
          Detection Rate: 0.4000
   Detection Prevalence: 0.6400
       Balanced Accuracy: 0.6095
        'Positive' Class: 0
```