R-Laboratory 6

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1.Load mtcars dataset.

Volvo 142E

21.4

```
# Loading mtcars dataset.
data(mtcars)
mtcars
                                                        qsec vs am gear carb
##
                         mpg cyl disp
                                        hp drat
                                                     wt
## Mazda RX4
                        21.0
                               6 160.0 110 3.90 2.620 16.46
                                                                   1
                        21.0
                                                                   1
                                                                             4
## Mazda RX4 Wag
                                6 160.0 110 3.90 2.875 17.02
                        22.8
                                                                   1
                                                                             1
## Datsun 710
                               4 108.0
                                        93 3.85 2.320 18.61
                                                                1
## Hornet 4 Drive
                                6 258.0 110 3.08 3.215 19.44
                                                                1
                                                                   9
                                                                             1
                        21.4
## Hornet Sportabout
                        18.7
                               8 360.0 175 3.15 3.440 17.02
                                                                             2
## Valiant
                        18.1
                               6 225.0 105 2.76 3.460 20.22
                                                                1
                                                                        3
                                                                             1
## Duster 360
                        14.3
                               8 360.0 245 3.21 3.570 15.84
                                                                             4
                                                                             2
                                         62 3.69 3.190 20.00
                                                                   0
## Merc 240D
                        24.4
                               4 146.7
                                                                1
                                                                        4
## Merc 230
                        22.8
                                4 140.8
                                         95 3.92 3.150 22.90
                                                                             2
## Merc 280
                        19.2
                                6 167.6 123 3.92 3.440 18.30
                                                                1
                                                                   0
                                                                             4
                               6 167.6 123 3.92 3.440 18.90
                                                                1
                                                                             4
## Merc 280C
                        17.8
                               8 275.8 180 3.07 4.070 17.40
                                                                   0
                                                                             3
## Merc 450SE
                        16.4
                                                                        3
                                                                             3
## Merc 450SL
                        17.3
                               8 275.8 180 3.07 3.730 17.60
                                                                   0
                                                                        3
                               8 275.8 180 3.07 3.780 18.00
## Merc 450SLC
                        15.2
                                                                             3
## Cadillac Fleetwood
                        10.4
                               8 472.0 205 2.93 5.250 17.98
                                                                0
                                                                        3
                                                                             4
                                                                   0
## Lincoln Continental 10.4
                               8 460.0 215 3.00 5.424 17.82
                                                                             4
                               8 440.0 230 3.23 5.345 17.42
                                                                   0
                                                                             4
## Chrysler Imperial
                        14.7
## Fiat 128
                        32.4
                                   78.7
                                         66 4.08 2.200 19.47
                                                                1
                                                                   1
                                                                             1
## Honda Civic
                        30.4
                                   75.7
                                         52 4.93 1.615 18.52
                                                                1
                                                                             2
                        33.9
                                   71.1
                                         65 4.22 1.835 19.90
                                                                1
                                                                        4
                                                                             1
## Toyota Corolla
## Toyota Corona
                        21.5
                               4 120.1
                                         97 3.70 2.465 20.01
                                                                1
                                                                   0
                                                                        3
                                                                             1
                                                                             2
## Dodge Challenger
                        15.5
                                8 318.0 150 2.76 3.520 16.87
                                                                        3
## AMC Javelin
                        15.2
                               8 304.0 150 3.15 3.435 17.30
                                                                        3
                                                                             2
## Camaro Z28
                        13.3
                               8 350.0 245 3.73 3.840 15.41
                                                                             4
                                                                   0
                                                                        3
                                                                             2
## Pontiac Firebird
                        19.2
                               8 400.0 175 3.08 3.845 17.05
                                                                   1
## Fiat X1-9
                        27.3
                                  79.0
                                         66 4.08 1.935 18.90
                                                                1
                                                                             1
## Porsche 914-2
                        26.0
                                4 120.3
                                         91 4.43 2.140 16.70
                                                                   1
                                                                             2
## Lotus Europa
                        30.4
                               4 95.1 113 3.77 1.513 16.90
                                                                1
                                                                             2
                               8 351.0 264 4.22 3.170 14.50
                                                                   1
                                                                        5
                                                                             4
## Ford Pantera L
                        15.8
## Ferrari Dino
                        19.7
                               6 145.0 175 3.62 2.770 15.50
                                                                0
                                                                   1
                                                                        5
                                                                             6
## Maserati Bora
                        15.0
                               8 301.0 335 3.54 3.570 14.60
                                                                0
                                                                   1
                                                                             8
```

4 121.0 109 4.11 2.780 18.60

2

2.install ridge and glmnet packages.

```
#install.packages(ridge)
#install.packages(glmnet)

library(ridge)  # Linear and logistic ridge regression functions.
library(Matrix)
library(glmnet)  # Lasso and Elastic-Net Regularized Generalized Linear
Models

## Loaded glmnet 4.1
```

3. Perform the exploratory data analysis.

```
# Pre-processing EDA
df = mtcars
str(df)
## 'data.frame':
                   32 obs. of 11 variables:
   $ mpg : num 21 21 22.8 21.4 18.7 18.1 14.3 24.4 22.8 19.2 ...
   $ cvl : num
##
                6 6 4 6 8 6 8 4 4 6 ...
##
  $ disp: num 160 160 108 258 360 ...
  $ hp : num 110 110 93 110 175 105 245 62 95 123 ...
##
  $ drat: num 3.9 3.9 3.85 3.08 3.15 2.76 3.21 3.69 3.92 3.92 ...
##
## $ wt : num 2.62 2.88 2.32 3.21 3.44 ...
## $ qsec: num 16.5 17 18.6 19.4 17 ...
## $ vs : num 0 0 1 1 0 1 0 1 1 1 ...
## $ am : num
               1110000000...
## $ gear: num 4 4 4 3 3 3 3 4 4 4 ...
## $ carb: num 4 4 1 1 2 1 4 2 2 4 ...
```

Insight

```
- Totally, 32 observations of 11 variables.
```

- All the 11 features are numerical datatypes.

Summary

summary(df)

```
##
                         cyl
                                          disp
         mpg
                                                           hp
##
   Min.
          :10.40
                    Min.
                           :4.000
                                    Min.
                                           : 71.1
                                                     Min.
                                                            : 52.0
##
   1st Qu.:15.43
                    1st Qu.:4.000
                                     1st Qu.:120.8
                                                     1st Qu.: 96.5
                    Median:6.000
                                    Median :196.3
##
   Median :19.20
                                                     Median :123.0
##
   Mean
           :20.09
                    Mean
                           :6.188
                                    Mean
                                            :230.7
                                                     Mean
                                                            :146.7
##
    3rd Qu.:22.80
                    3rd Qu.:8.000
                                     3rd Qu.:326.0
                                                     3rd Qu.:180.0
##
   Max.
           :33.90
                    Max.
                           :8.000
                                     Max.
                                            :472.0
                                                     Max.
                                                            :335.0
##
         drat
                          wt
                                          qsec
                                                           ٧S
## Min.
           :2.760
                    Min.
                           :1.513
                                    Min.
                                            :14.50
                                                     Min.
                                                            :0.0000
## 1st Qu.:3.080
                    1st Qu.:2.581
                                     1st Qu.:16.89
                                                     1st Qu.:0.0000
## Median :3.695
                    Median :3.325
                                    Median :17.71
                                                     Median :0.0000
## Mean :3.597
                    Mean :3.217
                                    Mean :17.85
                                                     Mean :0.4375
```

```
## 3rd Ou.:3.920
                  3rd Ou.:3.610
                                 3rd Ou.:18.90
                                                3rd Ou.:1.0000
##
  Max.
         :4.930
                  Max.
                        :5.424
                                 Max. :22.90
                                                Max. :1.0000
##
                                       carb
         am
                        gear
## Min.
          :0.0000
                   Min.
                          :3.000
                                  Min.
                                         :1.000
## 1st Qu.:0.0000
                   1st Qu.:3.000
                                  1st Qu.:2.000
## Median :0.0000
                   Median :4.000
                                  Median :2.000
## Mean
         :0.4062
                   Mean :3.688
                                  Mean
                                       :2.812
## 3rd Qu.:1.0000
                   3rd Qu.:4.000
                                  3rd Qu.:4.000
## Max.
          :1.0000
                         :5.000
                                  Max. :8.000
                   Max.
# Checking for missing values.
colSums(is.na(df))
## mpg cyl disp
                  hp drat
                          wt qsec
                                     VS
                                          am gear carb
##
     0
          0
                   0
                            0
                                      0
                                           0
                                               0
              0
                       0
                                 0
#Checking for Empty Values
colSums(df=='')
## mpg cyl disp
                  hp drat
                            wt gsec
                                     VS
                                          am gear carb
##
     0
          0
              0
                       0
                            0 0
                                      0
                                           0
                                               0
                   0
#Checking for Duplicate values
library(tidyverse)
## — Attaching packages
                   - tidyverse 1.3.0 --
## √ ggplot2 3.3.2
                     √ purrr
                               0.3.4
## √ tibble 3.0.3
                     √ dplyr
                               1.0.4
## √ tidyr
                    √ stringr 1.4.0
            1.1.1
## √ readr
                     \checkmark forcats 0.5.1
            1.4.0
## — Conflicts
                     — tidyverse_conflicts() —
## x tidyr::expand() masks Matrix::expand()
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
## x tidyr::pack() masks Matrix::pack()
## x tidyr::unpack() masks Matrix::unpack()
duplicated(df)
## [1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
FALSE
## [13] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
```

```
FALSE ## [25] FALSE FALSE FALSE FALSE FALSE FALSE
```

```
- The dataset is clean, there are no missing, Empty values or duplicated
record.

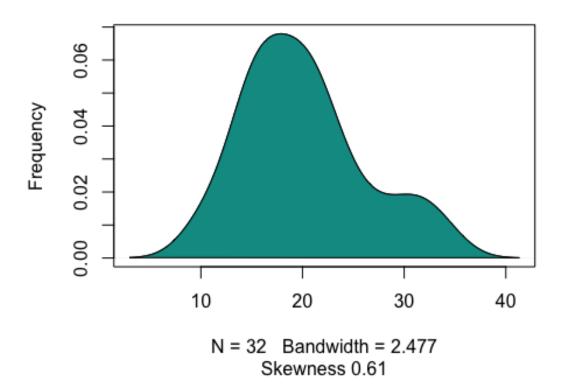
# Checking Normality of Response Variable

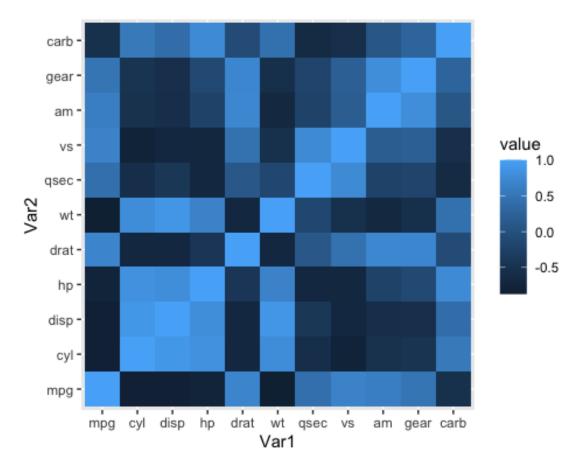
# Using this method, we obtain predictions from the model, as well as
decision values from the binary classifiers.
library(e1071)

# plot() - Visualizing data, support vectors and decision boundaries, if
provided.
plot(density(df$mpg),
    main = "Milage Density Plot",
    ylab="Frequency",
    sub=paste("Skewness",round(e1071::skewness(df$mpg),2))
    )

polygon(density(df$mpg), col='#079992')
```

Milage Density Plot





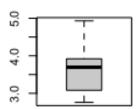
- Darker shades denotes less correlationship indications.
- Lighter shades denotes High correlationship with each variables.
- It is evident that most of the variables possess a high correlation with each other, thus we can assume multicollinearity is present.

#Checking for outliers in highly positive correlated values with Mileage

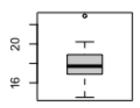
```
par(mfrow=c(2,3))

boxplot(df$drat, main = "Rear axle ratio")
boxplot(df$qsec, main = "1/4 mile time")
boxplot(df$gear, main = "Number of Forward Gears")
boxplot(df$hp, main = "Gross horsepower")
boxplot(df$cyl, main = "Number of cylinders")
boxplot(df$disp, main = "Displacement (cu.in.)")
```

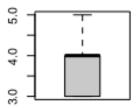
Rear axle ratio



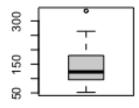
1/4 mile time



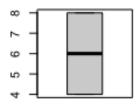
Number of Forward Gea



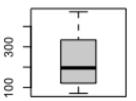
Gross horsepower



Number of cylinders



Displacement (cu.in.)



```
- There is an outlier found in qsec(1/4 mile time) and Gross horsepower.

#Building initial model

X = model.matrix(mpg~. , mtcars)[,-1]

Y = mtcars$mpg

#Splitting the data
set.seed(57)

trainingRow <- sample(1:nrow(df), 0.7*nrow(df))
trainset <- df[trainingRow,]
testset <- df[-trainingRow,]

lrm <- lm(trainset$mpg~., data=trainset)

summary(lrm)

##

## Call:
## lm(formula = trainset$mpg ~ ., data = trainset)

##
```

```
## Residuals:
               1Q Median
##
      Min
                                3Q
                                       Max
## -3.1759 -1.4218 -0.7548 1.0168 4.3028
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 8.55175
                         25.48468
                                    0.336
                                             0.744
## cyl
              -0.07409
                          1.35897
                                  -0.055
                                             0.957
## disp
               0.01402
                          0.02943
                                    0.476
                                             0.643
## hp
               -0.04564
                          0.03718 -1.227
                                             0.245
## drat
               1.01463
                          2.83182
                                    0.358
                                             0.727
                                             0.217
## wt
               -3.66520
                          2.79708 -1.310
                                             0.216
## qsec
               1.22513
                          0.93256 1.314
## vs
              -1.03224
                          2.89376 -0.357
                                             0.728
               4.89791
                          2.80389
                                   1.747
                                             0.108
## am
## gear
              -0.76347
                          2.07162 -0.369
                                             0.719
## carb
               1.00937
                          1.36147
                                    0.741
                                             0.474
##
## Residual standard error: 3.006 on 11 degrees of freedom
## Multiple R-squared: 0.8924, Adjusted R-squared: 0.7945
## F-statistic: 9.12 on 10 and 11 DF, p-value: 0.0005314
library(car)
## Loading required package: carData
##
## Attaching package: 'car'
## The following object is masked from 'package:dplyr':
##
##
      recode
## The following object is masked from 'package:purrr':
##
##
      some
vif(lrm)
##
        cyl
                 disp
                             hp
                                     drat
                                                 wt
                                                          qsec
                                                                      ٧S
am
## 14.567223 35.146018 19.377286 5.983737 20.942264 7.286081 4.928560
4.627183
       gear
##
                  carb
## 4.922279 12.942380
```

- All the values are above 5, there is strong multi-collinearity present.

```
MLR pred <- predict(lrm,testset)</pre>
compare <- cbind(actual=testset$mpg, MLR_pred)</pre>
compare
##
                        actual MLR pred
## Mazda RX4
                          21.0 25.73138
## Mazda RX4 Wag
                          21.0 25.48283
## Hornet Sportabout 18.7 16.18709
## Merc 450SE
                        16.4 13.86304
## Merc 450SL 17.3 15.35424
## Dodge Challenger 15.5 15.86656
## Camaro Z28 13.3 12.02072
## Pontiac Firebird 19.2 15.22923
## Lotus Europa 30.4 25.48280
## Ferrari Dino 19.7 21.79969
mean (apply(compare, 1, min)/apply(compare, 1, max))
## [1] 0.8654496
RMSE = sqrt(mean((testset$mpg-MLR_pred)^2))
RMSE# calculate accuracy
## [1] 3.242592
```

- Accuracy is only 81%, which is not very efficient.

4. Choose optimum lamba value.

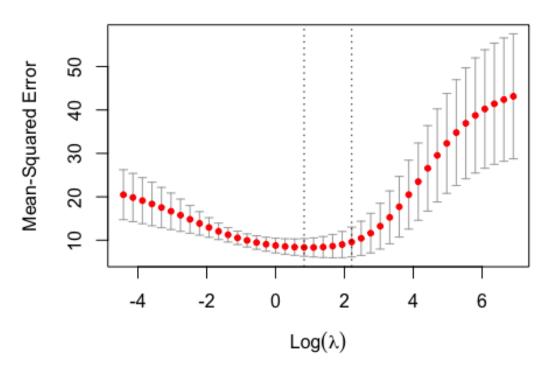
```
#Creating a sequence with an interval of -0.12
lambda_seq = 10^seq(3, -2, by = -.12)

# Using cross validation glmnet
ridge_model1 = cv.glmnet(X[trainingRow,], Y[trainingRow],alpha = 0,
type.measure = "mse", lambda = lambda_seq, nfolds = 5)

# Best Lambda value
best_lam = ridge_model1$lambda.min
best_lam
## [1] 2.290868

plot(ridge_model1)
```

10 10 10 10 10 10 10 10 10 10 10



Insight

- Optimum lamba value choosed and plotted.

5.Extract the model using k-cross validation.

```
best fit <- ridge model1$glmnet.fit</pre>
head(best_fit)
## $a0
##
          s0
                    s1
                              s2
                                        s3
                                                   s4
                                                             s5
                                                                       s6
s7
## 20.334559 20.292781 20.239225 20.171147 20.085525 19.979298 19.849725
19.694961
##
                    s9
          s8
                             s10
                                       s11
                                                  s12
                                                            s13
                                                                      s14
s15
## 19.514784 19.311363 19.089707 18.858175 18.627489 18.408886 18.213989
18.048764
##
         s16
                   s17
                             s18
                                       s19
                                                  s20
                                                            s21
                                                                      s22
s23
## 17.916799 17.809536 17.713541 17.605253 17.453561 17.211267 16.889578
16.443811
##
         s24
                   s25
                             s26
                                       s27
                                                  s28
                                                            s29
                                                                      s30
```

```
s31
## 15.867262 15.168862 14.373356 13.507767 12.617859 11.748121 10.943290
10.235891
##
                 s33
                           s34
                                              s36
                                                       s37
                                                                s38
        s32
                                    s35
s39
## 9.652625 9.195744 8.862197 8.633752 8.489987 8.407891 8.371597
8.363156
        s40
                 s41
##
   8.371917
             8.390624
##
## $beta
## 10 x 42 sparse Matrix of class "dgCMatrix"
##
     [[ suppressing 42 column names 's0', 's1', 's2' ... ]]
##
## cyl -0.0194178748 -0.0252966251 -0.0328380896 -0.0424341586 -0.0545182791
## disp -0.0002758091 -0.0003593572 -0.0004665682 -0.0006030428 -0.0007749987
       -0.0004186479 \ -0.0005454341 \ -0.0007081107 \ -0.0009151644 \ -0.0011760196
## drat 0.0533808300 0.0695996484 0.0904465457 0.1170416036 0.1506476225
## wt
       -0.0334154670 -0.0435648435 -0.0566082128 -0.0732447062 -0.0942618997
## qsec 0.0099463820 0.0129456398 0.0167847447 0.0216558137 0.0277673440
## vs
        0.0480936150 0.0627816340 0.0817150371 0.1059602526
## am
                                                            0.1367494081
## gear 0.0231786989
                     0.0302151718 0.0392546475
                                              0.0507776494
                                                            0.0653217181
## carb -0.0151921901 -0.0197946406 -0.0257010946 -0.0332208008 -0.0426979387
##
## cyl -0.0695388873 -0.087907973 -0.109928221 -0.135698629 -0.165015766
## disp -0.0009888889 -0.001250704 -0.001564942 -0.001933281 -0.002353179
       -0.0015004572 -0.001897588 -0.002374333 -0.002933503 -0.003571833
## hp
## drat 0.1926063151 0.244220147 0.306569016 0.380269080 0.465207714
       -0.1204958347 -0.152757675 -0.191720764 -0.237773900 -0.290863548
## qsec 0.0353274579 0.044516063 0.055444978 0.068109946 0.082345031
## VS
        0.1754431571 0.223451530 0.282103430 0.352467645 0.435148965
## am
## gear 0.0834498460 0.105691965 0.132453336 0.163890040 0.199763730
## carb -0.0544910930 -0.068936941 -0.086296270 -0.106686059 -0.130010072
##
## cvl
      -0.197283638 -0.231536306 -0.266464233 -0.300532751 -0.332346390
## disp -0.002816699 -0.003310496 -0.003816427 -0.004313505 -0.004781762
       -0.004278610 -0.005035651 -0.005819007 -0.006602703 -0.007362891
## drat 0.560329707 0.663541512 0.771838464 0.881686019 0.989424926
## wt
       -0.350375086 -0.415083181 -0.483257506 -0.552919185 -0.622047734
## qsec 0.097799533 0.113949489 0.130172146 0.145876393 0.160608946
## vs
        0.540065290 0.626210735 0.709690715 0.785227191 0.847558044
## am
        0.530113606  0.636590523  0.753147026  0.877942427
                                                         1.008998300
## gear 0.239303462 0.281113209 0.323170856 0.362934380 0.397554449
## carb -0.155910631 -0.183762893 -0.212736212 -0.241908068 -0.270379880
##
## cyl -0.360528450 -0.384297972 -0.402843612 -0.415951073 -0.423452517
```

```
## disp -0.005203051 -0.005565010 -0.005860181 -0.006085898 -0.006242758
       -0.008082416 -0.008750542 -0.009369868 -0.009946048 -0.010492122
## hp
## drat
        1.091995922 1.186915651 1.273366396 1.351086594
                                                       1.420900908
       -0.689079862 -0.752763379 -0.812840558 -0.869349465 -0.923011403
## wt
## qsec 0.174252289 0.186977416 0.199466299 0.212655588
                                                       0.227820785
## vs
        0.892306277  0.916099663  0.917099338  0.894707619
                                                        0.849574240
        1.144739301 1.284064223 1.426749223
                                            1.573181967 1.724338051
## am
## gear
        0.424144323 0.440141829 0.443347589
                                            0.432389871
                                                        0.406596869
## carb -0.297386038 -0.322313670 -0.344555506 -0.363509808 -0.378370411
##
       -0.425167325 -0.42005450 -0.410120588 -0.393896701 -0.371281213
## cyl
## disp -0.006333105 -0.00635348 -0.006332249 -0.006253825 -0.006116423
## hp
       -0.011026914 -0.01158088 -0.012176779 -0.012846804 -0.013629891
## drat 1.484296094 1.54371974 1.598688328 1.650251164
                                                       1.697789077
       -0.975109142 -1.02826126 -1.081801192 -1.139297646 -1.202947602
## wt
## gsec 0.246460918 0.27054145 0.300209136 0.337137522 0.381754764
## vs
        0.783255381  0.69856011  0.594295394  0.475105213
                                                       0.343307682
        1.881503356 2.04674980 2.218420823 2.398691570
                                                       2.587386755
## am
## gear 0.365963926 0.31086667 0.242390790 0.162379925
                                                       0.072948414
## carb -0.388033773 -0.39096250 -0.385571567 -0.370499385 -0.344427489
##
      -0.342463622 -0.30873866 -0.270348779 -0.229806214 -0.188672924
## cyl
## disp -0.005911888 -0.00561437 -0.005202658 -0.004637032 -0.003898958
       -0.014564976 -0.01566547 -0.016983067 -0.018515083 -0.020283937
## hp
## drat 1.739537496 1.77200174 1.793661659 1.801191849 1.793749442
       -1.274860253 -1.35695787 -1.451703556 -1.560721178 -1.684862780
## qsec 0.433804547 0.49221963 0.555823870 0.622550805
                                                       0.690414395
## vs
        ## am
## gear -0.023108235 -0.12124949 -0.218706221 -0.310809428 -0.395541062
## carb -0.306557135 -0.25743708 -0.196781736 -0.126129760 -0.046146270
## cyl -0.14959444 -0.114321523 -0.0859363880 -0.0640708118 -0.049428577
## disp -0.00296822 -0.001852804 -0.0005431506 0.0008965152 0.002426298
       -0.02226644 \ -0.024430897 \ -0.0266952816 \ -0.0290085396 \ -0.031286481
## drat 1.77054264 1.732788652 1.6811238095
                                           1.6198149498
                                                         1.551854476
       -1.82401345 -1.976241190 -2.1402540939 -2.3104968329 -2.482769028
## wt
## qsec 0.75729715 0.821420677 0.8812996172 0.9360143581
                                                         0.984986034
       ## vs
                  3.951100196
                              4.1088358846
                                           4.2489768787
## am
        3.77642780
                                                         4.370390310
## gear -0.47057546 -0.535317980 -0.5882799241 -0.6313053773 -0.664915963
## carb 0.04134609 0.134470039 0.2303378572 0.3267476137 0.420873237
##
## cyl -0.040722148 -0.036836911 -0.036072576 -0.037993027 -0.040630461
## disp 0.003967958 0.005458692 0.006830848 0.008074849
                                                       0.009127739
## hp
       -0.033461559 -0.035471692 -0.037271014 -0.038840130 -0.040163313
## drat 1.481742944 1.413049417
                               1.349248180
                                            1.291229019
                                                        1.241674091
       -2.650541028 -2.808574581 -2.951544054 -3.078901358 -3.186057739
## wt
## qsec 1.027968753 1.064995577
                               1.096234180
                                           1.122274794
                                                        1.143304513
      -0.883811415 -0.922412693 -0.952499479 -0.974827201 -0.992625860
```

```
4.473871578 4.560469250 4.631924264 4.689726505 4.736066941
## am
## gear -0.690910987 -0.710635426 -0.725678449 -0.736618641 -0.745245241
## carb 0.510141494 0.592324213 0.665634193 0.729630910 0.783468884
##
## cyl -0.04406097 -0.04759208
## disp 0.01002471 0.01075943
       -0.04126095 -0.04214877
## hp
## drat 1.19944143 1.16467932
## wt
       -3.27637387 -3.34992102
## qsec 1.16026691 1.17361996
## vs
     -1.00570722 -1.01567187
## am
        4.77257000 4.80094436
## gear -0.75148098 -0.75619184
## carb 0.82821911 0.86447869
##
## $df
10 10
##
## $dim
## [1] 10 42
##
## $lambda
  [1] 1.000000e+03 7.585776e+02 5.754399e+02 4.365158e+02 3.311311e+02
## [6] 2.511886e+02 1.905461e+02 1.445440e+02 1.096478e+02 8.317638e+01
## [11] 6.309573e+01 4.786301e+01 3.630781e+01 2.754229e+01 2.089296e+01
## [16] 1.584893e+01 1.202264e+01 9.120108e+00 6.918310e+00 5.248075e+00
## [21] 3.981072e+00 3.019952e+00 2.290868e+00 1.737801e+00 1.318257e+00
## [26] 1.000000e+00 7.585776e-01 5.754399e-01 4.365158e-01 3.311311e-01
## [31] 2.511886e-01 1.905461e-01 1.445440e-01 1.096478e-01 8.317638e-02
## [36] 6.309573e-02 4.786301e-02 3.630781e-02 2.754229e-02 2.089296e-02
## [41] 1.584893e-02 1.202264e-02
##
## $dev.ratio
## [1] 0.06108987 0.07915888 0.10204834 0.13070259 0.16603686 0.20879069
## [7] 0.25931876 0.31734285 0.38172109 0.45033252 0.52018246 0.58780504
## [13] 0.64985860 0.70377117 0.74818554 0.78300796 0.80915562 0.82815348
## [19] 0.84165396 0.85118415 0.85799058 0.86302353 0.86690343 0.87007810
## [25] 0.87282648 0.87530903 0.87758983 0.87972123 0.88169272 0.88350751
## [31] 0.88515014 0.88661178 0.88788129 0.88895987 0.88984982 0.89055920
## [37] 0.89110407 0.89150530 0.89179271 0.89198805 0.89211952 0.89220514
```

6.Build the final model and interpret.

```
linRidgeMod = linearRidge(trainset$mpg ~ ., data = trainset)
predicted = predict(linRidgeMod, testset) # predict on test data
compare1 = cbind (actual=testset$mpg, predicted)
mean (apply(compare1, 1, min)/apply(compare1, 1, max))
```

```
## [1] 0.9029484
summary(linRidgeMod)
## Call:
## linearRidge(formula = trainset$mpg ~ ., data = trainset)
##
## Coefficients:
                Estimate Scaled estimate Std. Error (scaled) t value (scaled)
## (Intercept) 14.742140
                                       NA
                                                            NA
                                                                             NA
                                -2.753488
## cyl
               -0.326153
                                                      3.321952
                                                                          0.829
               -0.005767
## disp
                                -3.492460
                                                      2.841631
                                                                          1.229
## hp
               -0.015200
                                -5.409057
                                                      3.161192
                                                                          1.711
## drat
               1.757967
                                 4.564728
                                                      3.400698
                                                                          1.342
## wt
               -1.322165
                                -6.502449
                                                      3.091123
                                                                          2.104
                0.468642
                                 4.077506
                                                     3.255874
                                                                          1.252
## qsec
                0.103222
                                 0.238042
                                                     3.398804
                                                                          0.070
## VS
## am
                2.909703
                                 6.710119
                                                     3.236733
                                                                          2.073
## gear
               -0.086758
                                -0.279297
                                                     3.248383
                                                                          0.086
                                -2.201791
                                                     3.031816
                                                                          0.726
## carb
               -0.277200
               Pr(>|t|)
##
## (Intercept)
                     NA
                 0.4072
## cyl
                 0.2191
## disp
## hp
                 0.0871 .
                 0.1795
## drat
## wt
                 0.0354 *
## qsec
                 0.2104
## vs
                 0.9442
## am
                 0.0382 *
## gear
                 0.9315
## carb
                 0.4677
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Ridge parameter: 0.1286921, chosen automatically, computed using 3 PCs
## Degrees of freedom: model 5.755 , variance 4.066 , residual 7.443
Creating another model with only significant values.
linRidgeMod = linearRidge(trainset$mpg ~ ., data = trainset[, c(6,10,11)])
predicted1 = predict(linRidgeMod, testset) # predict on test data
compare2 = cbind (actual=testset$mpg, predicted1)
mean (apply(compare2, 1, min)/apply(compare2, 1, max))
## [1] 0.9464945
```

```
summary(linRidgeMod)
##
## Call:
## linearRidge(formula = trainset$mpg ~ ., data = trainset[, c(6,
       10, 11)])
##
##
## Coefficients:
               Estimate Scaled estimate Std. Error (scaled) t value (scaled)
                 27.642
## (Intercept)
                                     NA
                                                         NA
                 -3.316
                                -16.308
                                                      4.659
                                                                       3.500
## wt
                                 6.193
                                                      4.089
## gear
                 1.924
                                                                       1.514
## carb
                 -1.395
                                -11.082
                                                      4.262
                                                                       2.600
##
               Pr(>|t|)
## (Intercept)
                     NA
               0.000465 ***
## wt
## gear
               0.129929
               0.009319 **
## carb
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Ridge parameter: 0.04208334, chosen automatically, computed using 2 PCs
## Degrees of freedom: model 2.698 , variance 2.457 , residual 2.939
RMSE = sqrt(mean((testset$mpg-predicted1)^2))
RMSE
## [1] 1.389815
```

- The accuracy has increased from 75% to 88%.
- Root-Mean-Square Error has decreased from 3.242 to 1.389