Home Work Assignment - 03

Critical Thinking Group 5

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Overview

To attain our objective, we will be following the below best practice steps and guidelines:

- 1 -Data Exploration
- 2 -Data Preparation
- 3 -Build Models
- 4 -Select Models

```
'data.frame':
                    466 obs. of 14 variables:
    $ zn
                    0 0 0 30 0 0 0 0 0 80 ...
##
             : num
    $ indus : num 19.58 19.58 18.1 4.93 2.46 ...
##
    $ chas
            : int
                    0 1 0 0 0 0 0 0 0 0 ...
##
                    0.605 0.871 0.74 0.428 0.488 0.52 0.693 0.693 0.515 0.392 ...
    $ nox
             : num
##
    $ rm
             : num 7.93 5.4 6.49 6.39 7.16 ...
                    96.2 100 100 7.8 92.2 71.3 100 100 38.1 19.1 ...
##
    $ age
             : num
##
    $ dis
                    2.05 1.32 1.98 7.04 2.7 ...
             : num
##
    $ rad
             : int
                    5 5 24 6 3 5 24 24 5 1 ...
##
                    403 403 666 300 193 384 666 666 224 315 ...
    $ tax
             : int
##
    $ ptratio: num
                    14.7 14.7 20.2 16.6 17.8 20.9 20.2 20.2 20.2 16.4 ...
                    369 397 387 375 394 ...
##
    $ black : num
##
    $ lstat : num
                    3.7 26.82 18.85 5.19 4.82 ...
##
    $ medv
            : num 50 13.4 15.4 23.7 37.9 26.5 5 7 22.2 20.9 ...
    $ target : int 1 1 1 0 0 0 1 1 0 0 ...
##
                          indus
          zn
                                            chas
                                                               nox
             0.00
                             : 0.460
                                              :0.00000
##
    Min.
           :
                     Min.
                                       Min.
                                                          Min.
                                                                 :0.3890
                     1st Qu.: 5.145
##
    1st Qu.:
             0.00
                                       1st Qu.:0.00000
                                                          1st Qu.:0.4480
##
    Median: 0.00
                     Median: 9.690
                                       Median :0.00000
                                                          Median :0.5380
          : 11.58
##
    Mean
                     Mean
                             :11.105
                                       Mean
                                              :0.07082
                                                          Mean
                                                                 :0.5543
##
    3rd Qu.: 16.25
                     3rd Qu.:18.100
                                       3rd Qu.:0.00000
                                                          3rd Qu.:0.6240
##
           :100.00
                                       Max.
                                              :1.00000
    Max.
                     Max.
                             :27.740
                                                          Max.
                                                                 :0.8710
##
          rm
                                           dis
                                                             rad
                         age
##
    Min.
           :3.863
                    Min.
                           : 2.90
                                      Min.
                                             : 1.130
                                                       Min.
                                                               : 1.00
##
    1st Qu.:5.887
                    1st Qu.: 43.88
                                      1st Qu.: 2.101
                                                        1st Qu.: 4.00
##
    Median :6.210
                    Median: 77.15
                                      Median : 3.191
                                                       Median: 5.00
##
    Mean
           :6.291
                           : 68.37
                                      Mean
                                             : 3.796
                                                       Mean
                                                               : 9.53
                    Mean
##
    3rd Qu.:6.630
                    3rd Qu.: 94.10
                                      3rd Qu.: 5.215
                                                        3rd Qu.:24.00
           :8.780
##
    Max.
                            :100.00
                                      Max.
                                             :12.127
                                                       Max.
                                                               :24.00
                    Max.
##
                       ptratio
                                        black
                                                          lstat
         tax
                                                             : 1.730
##
   Min.
           :187.0
                    Min.
                            :12.6
                                           : 0.32
                                                      Min.
                                    Min.
##
    1st Qu.:281.0
                    1st Qu.:16.9
                                    1st Qu.:375.61
                                                      1st Qu.: 7.043
##
   Median :334.5
                    Median:18.9
                                                      Median :11.350
                                    Median :391.34
##
    Mean
           :409.5
                    Mean
                            :18.4
                                    Mean
                                           :357.12
                                                      Mean
                                                             :12.631
##
    3rd Qu.:666.0
                    3rd Qu.:20.2
                                    3rd Qu.:396.24
                                                      3rd Qu.:16.930
##
    Max.
           :711.0
                    Max.
                            :22.0
                                    Max.
                                           :396.90
                                                      Max.
                                                             :37.970
##
         medv
                        target
##
   Min.
           : 5.00
                    Min.
                            :0.0000
                    1st Qu.:0.0000
##
    1st Qu.:17.02
## Median :21.20
                    Median :0.0000
##
  Mean
           :22.59
                    Mean
                            :0.4914
##
    3rd Qu.:25.00
                    3rd Qu.:1.0000
## Max.
           :50.00
                    Max.
                            :1.0000
```

```
40 obs. of 13 variables:
##
    $ zn
              : int
                     0 0 0 0 0 25 25 0 0 0 ...
    $ indus
                     7.07 8.14 8.14 8.14 5.96 5.13 5.13 4.49 4.49 2.89 ...
##
             : num
##
                     0 0 0 0 0 0 0 0 0 0 ...
    $ chas
               int
##
    $
      nox
              : num
                     0.469 \ 0.538 \ 0.538 \ 0.538 \ 0.499 \ 0.453 \ 0.453 \ 0.449 \ 0.449 \ 0.445 \ \dots
##
    $ rm
                     7.18 6.1 6.5 5.95 5.85 ...
##
    $ age
              : num
                     61.1 84.5 94.4 82 41.5 66.2 93.4 56.1 56.8 69.6 ...
##
    $
      dis
               num
                     4.97 4.46 4.45 3.99 3.93 ...
##
    $ rad
                     2 4 4 4 5 8 8 3 3 2 ...
             : int
##
    $ tax
              : int
                     242 307 307 307 279 284 284 247 247 276 ...
##
                     17.8 21 21 21 19.2 19.7 19.7 18.5 18.5 18 ...
      ptratio: num
##
    $ black
               num
                     393 380 388 233 397 ...
##
                     4.03 10.26 12.8 27.71 8.77 ...
    $ lstat
               num
                     34.7 18.2 18.4 13.2 21 18.7 16 26.6 22.2 21.4 ...
```

1 Data Exploration Analysis

In section we will explore and gain some insights into the dataset by pursuing the below high level steps and inquiries:

- -Variable identification
- -Variable Relationships
- -Data summary analysis
- -Outliers and Missing Values Identification

1.1 Variable identification

First let's display and examine the data dictionary or the data columns as shown in table 1 and proportion of success and failure cases in target variable.

```
indus
##
          zn
                                               chas
                                                                  nox
    Min.
            :
               0.00
                      Min.
                              : 0.460
                                         Min.
                                                 :0.00000
                                                             Min.
                                                                     :0.3890
               0.00
                       1st Qu.: 5.145
                                         1st Qu.:0.00000
                                                             1st Qu.:0.4480
##
    1st Qu.:
    Median :
               0.00
                      Median: 9.690
                                         Median :0.00000
                                                             Median :0.5380
##
##
                                                 :0.07082
    Mean
            : 11.58
                              :11.105
                                         Mean
                                                             Mean
                                                                     :0.5543
                       Mean
                                         3rd Qu.:0.00000
                                                             3rd Qu.:0.6240
    3rd Qu.: 16.25
                       3rd Qu.:18.100
##
    Max.
            :100.00
                       Max.
                              :27.740
                                         Max.
                                                 :1.00000
                                                             Max.
                                                                     :0.8710
##
          rm
                                              dis
                                                                rad
                           age
                             : 2.90
##
    Min.
            :3.863
                     Min.
                                        Min.
                                                : 1.130
                                                           Min.
                                                                  : 1.00
##
    1st Qu.:5.887
                     1st Qu.: 43.88
                                        1st Qu.: 2.101
                                                           1st Qu.: 4.00
##
    Median :6.210
                     Median: 77.15
                                        Median : 3.191
                                                           Median: 5.00
                     Mean
##
    Mean
            :6.291
                             : 68.37
                                        Mean
                                                : 3.796
                                                           Mean
                                                                  : 9.53
##
    3rd Qu.:6.630
                     3rd Qu.: 94.10
                                        3rd Qu.: 5.215
                                                           3rd Qu.:24.00
##
    Max.
            :8.780
                             :100.00
                                                :12.127
                                                           Max.
                                                                   :24.00
                     Max.
                                        Max.
##
                         ptratio
                                          black
                                                             lstat
         tax
##
    Min.
            :187.0
                             :12.6
                                              : 0.32
                                                        Min.
                                                                : 1.730
                     Min.
                                      Min.
    1st Qu.:281.0
                     1st Qu.:16.9
                                      1st Qu.:375.61
                                                         1st Qu.: 7.043
##
    Median :334.5
                     Median:18.9
                                      Median :391.34
                                                        Median :11.350
            :409.5
                             :18.4
                                              :357.12
##
    Mean
                     Mean
                                      Mean
                                                        Mean
                                                                :12.631
##
    3rd Qu.:666.0
                     3rd Qu.:20.2
                                      3rd Qu.:396.24
                                                        3rd Qu.:16.930
                             :22.0
                                              :396.90
                                                                :37.970
    Max.
            :711.0
                     Max.
                                      Max.
                                                        Max.
```

```
## medv target

## Min. : 5.00 Min. :0.0000

## 1st Qu.:17.02 1st Qu.:0.0000

## Median :21.20 Median :0.0000

## Mean :22.59 Mean :0.4914

## 3rd Qu.:25.00 3rd Qu.:1.0000

## Max. :50.00 Max. :1.0000

## ## 0 1

## 0.5085837 0.4914163
```

1.2 Data Summary Analysis

In this section, we will create summary data to better understand the initial relationship variables have with our dependent variable using correlation, central tendency, and dispersion As shown in table 2.

##		vars	n	mean	sd	median	trimmed	mad	min	max	range
##	zn	1	466	11.58	23.36	0.00	5.35	0.00	0.00	100.00	100.00
##	indus	2	466	11.11	6.85	9.69	10.91	9.34	0.46	27.74	27.28
##	chas	3	466	0.07	0.26	0.00	0.00	0.00	0.00	1.00	1.00
##	nox	4	466	0.55	0.12	0.54	0.54	0.13	0.39	0.87	0.48
##	rm	5	466	6.29	0.70	6.21	6.26	0.52	3.86	8.78	4.92
##	age	6	466	68.37	28.32	77.15	70.96	30.02	2.90	100.00	97.10
##	dis	7	466	3.80	2.11	3.19	3.54	1.91	1.13	12.13	11.00
##	rad	8	466	9.53	8.69	5.00	8.70	1.48	1.00	24.00	23.00
##	tax	9	466	409.50	167.90	334.50	401.51	104.52	187.00	711.00	524.00
##	ptratio	10	466	18.40	2.20	18.90	18.60	1.93	12.60	22.00	9.40
##	black	11	466	357.12	91.32	391.34	383.51	8.24	0.32	396.90	396.58
##	lstat	12	466	12.63	7.10	11.35	11.88	7.07	1.73	37.97	36.24
##	medv	13	466	22.59	9.24	21.20	21.63	6.00	5.00	50.00	45.00
##	target	14	466	0.49	0.50	0.00	0.49	0.00	0.00	1.00	1.00
##	skew kurtosis se										
##	zn	2.18	3	3.81	1.08						
##	indus	0.29	9	-1.24 ().32						
##	chas	3.34	1	9.15 (0.01						
##	nox	0.75	5	-0.04 (0.01						
##	rm	0.48	3	1.54 (0.03						
##	age	-0.58	3	-1.01	l.31						
##	dis	1.00)	0.47 (0.10						
##	rad	1.03	L	-0.86 (0.40						
##	tax	0.66	3	-1.15	7.78						
##	ptratio	-0.75	5	-0.40 (0.10						
##	black	-2.92	2	7.34	1.23						
##	lstat	0.93	L	0.50 (0.33						
##	medv	1.08	3	1.37 (0.43						
##	target	0.03	3	-2.00 (0.02						
##	zn	ind	dus	chas	noz	ς <u>1</u>	rm ag	ge d	dis	rad	tax
##	0		0	0	()	0	0	0	0	0
##	ptratio	bla	ack	lstat	medv	/ targe	et				
##	0		0	0	(0				

Table 1: Correlation between target and predictor variable

	Correlation
zn	-0.4316818
indus	0.6048507
chas	0.0800419
nox	0.7261062
rm	-0.1525533
age	0.6301062
dis	-0.6186731
rad	0.6281049
tax	0.6111133

	Correlation
ptratio	0.2508489
black	-0.3529568
lstat	0.4691270
medv	-0.2705507
target	1.0000000

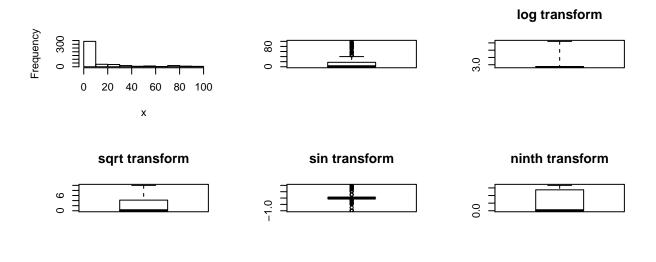
It is clear from the table that most of the variables are having storng correlation with the target variable.

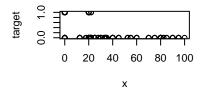
1.3 Outliers and Missing Values Identification

In this section we look at boxplots to determine the outliers in variables and decide on whether to act on the outliers.

Lets do some univariate analysis. We will look at the Histogram and Boxplot for each variable to detect outliers if any and treat it accordingly.

Analysis of variable zn:proportion of residential land zoned for large lots





For zn, we can see that there are large number of values with 0. ninth transformation seem better for this variable..(1)

*

**Please note that we have created similar figures to figure 1 above for each remaining variable. However, we hid the remaining figures for ease of streamlining the report as they have similar shapes. However, we have drawn the below observations from each remaining figure.

For indus, we can see that there is a spike toward right side of he distribution. Looking at the sqrt transformation it appears that distribution is close to normal and having two peaks after transformation.

For nox, there is a long right tail.

For rm, there are some outliers as we can see from box plot. This variable will need some transformation to handle the outliers.

age of the building variable is skewed heavily towards right side. We will need some transformation for this variable and looks sin transformation is best option for this case

For this variable dis, there are some outliers which needs transformation to handle those outliers. log transformation looks best suited for this scenario.

For rad variable distribution is not uniform as seen from the chart and will need transformation.

For tax variable is not uniformly distributed but there is no outlier for this variable.

For pratio has right aligned peak but no outliers are there in data set.

The variable lstat has long right tail and lef skewed

2. Data Preparation

Now that we have completed the preliminary analysis, we will be cleaning and consolidating data into one dataset for use in analysis and modeling. We will be puring the below steps as guidlines:

- Outliers treatment
- Missing values treatment
- Data transformation

2.1 Outliers treatment

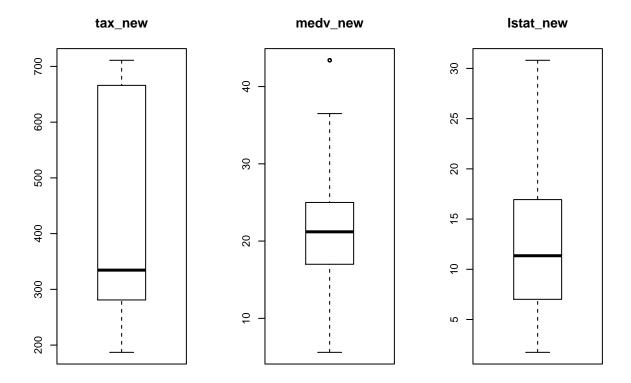
For outliers, we will create 2 sets of variables.

The first set uses the capping method. In this method, we will replace all outliers that lie outside the 1.5 times of IQR limits. We will cap it by replacing those observations less than the lower limit with the value of 5th %ile and those that lie above the upper limit with the value of 95th %ile.

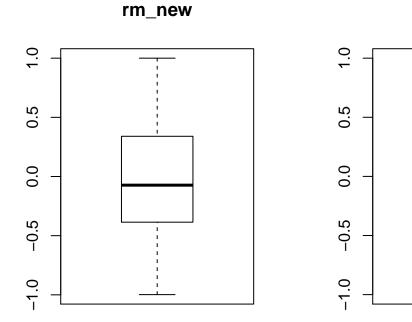
Accordingly we create the following new variables while retaining the original variables.

```
\begin{array}{c} \text{city\_crime\_train} tax \ city_crime_train \text{medv} \\ \text{city\_crime\_train} \$ \text{lstat} \end{array}
```

Lets see how the new variables look in boxplots.



In the second set, we will use the sin transformation and create the following variables: $city_crime_trainrm_new\ city_crime_traindis_new$



2.3 Tranformation for Variables

Following variables will need some transformation:

- 1. zn: proportion of residential land zoned for large lots (over 25000 square feet) (predictor variable)
- 2. chas: a dummy var. for whether the suburb borders the Charles River (1) or not (0) (predictor variable)

dis_new

3. target: whether the crime rate is above the median crime rate (1) or not (0) (response variable)

2.6

Lets see how the new variables stack up against wins.

All new variables seem to have a positive correlation with wins. However, some of them do not seem to have a strong correlation. Lets see how they perform while modeling.

3 Build Models

Below is a summary table showing models and their respective variables.

3.1 Model One

In this model, we will be using the original variables. We will create model and we will highlight the variables that being recommended using the AIC value.

First we will produce the summary model as per below:

```
##
## Call:
  glm(formula = target ~ . - zn_new - rm_new - lstat_new - tax_new -
##
       medv_new, family = "binomial", data = city_crime_train)
##
## Deviance Residuals:
##
       Min
                      Median
                                   3Q
                 1Q
                                            Max
                    -0.0017
  -1.8469 -0.1389
                               0.0007
                                         3.3050
##
## Coefficients:
                 Estimate Std. Error z value Pr(>|z|)
##
                                      -5.343 9.14e-08 ***
## (Intercept) -39.967503
                            7.480155
                                      -0.501 0.61649
## zn
                -0.014489
                            0.028929
## indus
                 0.003888
                            0.055889
                                       0.070
                                               0.94454
## chas1
                 0.464046
                            0.743387
                                       0.624
                                              0.53248
                            8.209555
## nox
                53.269267
                                       6.489 8.66e-11 ***
## rm
                -0.862730
                            0.851113
                                      -1.014
                                              0.31075
## age
                 0.041618
                            0.015426
                                       2.698
                                               0.00698 **
## dis
                 0.476938
                            0.276948
                                       1.722 0.08505 .
## rad
                 0.800898
                            0.200223
                                       4.000 6.33e-05 ***
## tax
                -0.005040
                            0.003082
                                      -1.635
                                              0.10201
## ptratio
                 0.442846
                            0.142815
                                       3.101
                                               0.00193 **
## black
                -0.011963
                            0.005945
                                      -2.012
                                               0.04421 *
## lstat
                 0.036461
                            0.057025
                                       0.639
                                               0.52257
                 0.230818
                            0.078475
                                              0.00327 **
## medv
                                       2.941
                -1.892538
                            0.477332
                                      -3.965 7.34e-05 ***
## dis_new
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
  (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 645.88
                              on 465 degrees of freedom
## Residual deviance: 165.64
                             on 451 degrees of freedom
## AIC: 195.64
##
## Number of Fisher Scoring iterations: 9
##
##
  target FALSE TRUE
##
        0
            234
                   3
##
        1
             35
                 194
```

3.1 Model One with backward step function

```
stepmodel1<- step(model1, direction="backward")</pre>
```

```
## Start: AIC=195.64
## target ~ (zn + indus + chas + nox + rm + age + dis + rad + tax +
      ptratio + black + lstat + medv + tax new + medv new + lstat new +
##
      rm_new + dis_new + zn_new) - zn_new - rm_new - lstat_new -
##
      tax_new - medv_new
##
            Df Deviance
                165.64 193.64
## - indus
            1
## - zn
             1
                165.91 193.91
## - chas
                166.02 194.02
            1
## - lstat
            1 166.04 194.04
             1 166.67 194.67
## - rm
## <none>
                 165.63 195.63
## - tax
            1 168.25 196.25
## - dis
             1 168.29 196.29
## - black
             1
                170.84 198.84
## - age
                173.83 201.83
             1
## - medv
                175.65 203.65
## - ptratio 1
                 176.06 204.06
## - dis new 1
                 186.15 214.15
                 197.68 225.68
## - rad
             1
## - nox
             1
                 246.22 274.22
##
## Step: AIC=193.64
## target ~ zn + chas + nox + rm + age + dis + rad + tax + ptratio +
      black + lstat + medv + dis_new
##
            Df Deviance
##
                          AIC
            1 165.93 191.93
## - zn
## - lstat
            1 166.05 192.05
## - chas
            1
               166.08 192.08
## - rm
             1 166.68 192.68
## <none>
                 165.64 193.64
## - dis
            1 168.29 194.29
               168.88 194.88
## - tax
             1
## - black
             1 170.88 196.88
## - age
             1
                173.85 199.85
## - medv
             1
                175.68 201.68
## - ptratio 1
                 176.11 202.11
## - dis_new 1
                 188.52 214.52
## - rad
             1
                 203.74 229.74
             1 254.38 280.38
## - nox
## Step: AIC=191.93
## target ~ chas + nox + rm + age + dis + rad + tax + ptratio +
##
      black + lstat + medv + dis_new
##
##
            Df Deviance
                          AIC
## - lstat
             1
                166.24 190.24
                 166.44 190.44
## - chas
             1
## - rm
                167.27 191.27
             1
## <none>
                 165.93 191.93
## - dis
            1 168.35 192.35
           1 169.33 193.33
## - tax
```

```
## - black 1 171.28 195.28
## - age
             1 174.85 198.85
                176.18 200.18
## - medv
            1
## - ptratio 1
                178.45 202.45
## - dis_new 1
                193.29 217.29
## - rad 1
                 206.94 230.94
## - nox
                 256.56 280.56
##
## Step: AIC=190.24
## target ~ chas + nox + rm + age + dis + rad + tax + ptratio +
      black + medv + dis_new
##
            Df Deviance
##
                          AIC
## - chas
            1 166.88 188.88
## <none>
                 166.24 190.24
## - rm
               168.56 190.56
## - dis
            1 168.93 190.93
## - tax
            1 169.45 191.45
## - black 1 171.49 193.49
            1 176.71 198.71
## - medv
## - age
            1 178.84 200.84
## - ptratio 1 179.38 201.38
## - dis_new 1
                193.58 215.58
## - rad
             1 207.44 229.44
## - nox
             1 258.50 280.50
## Step: AIC=188.88
## target ~ nox + rm + age + dis + rad + tax + ptratio + black +
      medv + dis_new
##
##
            Df Deviance
                          AIC
## <none>
                 166.88 188.88
               169.24 189.24
## - dis
## - rm
               169.51 189.51
             1
## - tax
             1
                170.28 190.28
## - black 1
                171.96 191.96
## - medv
            1
                177.75 197.75
## - ptratio 1
                179.47 199.47
## - age
             1
                 180.74 200.74
## - dis_new 1
                 195.77 215.77
## - rad
             1
                 209.89 229.89
## - nox
             1 258.55 278.55
pre_train1_step<-predict(stepmodel1,type="response")</pre>
table(target,pre_train1_step >0.75)
##
## target FALSE TRUE
```

##

##

0

1

234

34 195

3

3.2 Model two

In this model, we will be using the some transformed variables.

First we will produce the summary model as per below:

```
##
## Call:
## glm(formula = target ~ . - zn - rm - dis - tax - lstat - medv,
       family = "binomial", data = city_crime_train)
##
##
## Deviance Residuals:
##
      Min
                10
                      Median
                                   3Q
                                           Max
## -1.7978 -0.1372 -0.0012
                               0.0006
                                        3.7479
##
## Coefficients:
##
                 Estimate Std. Error z value Pr(>|z|)
## (Intercept) -41.631145
                           7.066597
                                     -5.891 3.83e-09 ***
## indus
                 0.010371
                            0.055697
                                       0.186 0.852285
## chas1
                 0.386972
                            0.716324
                                       0.540 0.589045
                49.978105
                            7.574874
                                       6.598 4.17e-11 ***
## nox
                0.039466
                            0.014272
                                       2.765 0.005689 **
## age
## rad
                0.823571
                            0.203804
                                      4.041 5.32e-05 ***
                0.432948
                            0.150308
## ptratio
                                       2.880 0.003972 **
                -0.011718
                            0.005890 -1.990 0.046641 *
## black
                -0.005283
                            0.003017 -1.751 0.079911 .
## tax new
## medv new
                0.224594
                            0.067847
                                       3.310 0.000932 ***
## 1stat new
                0.021292
                            0.063375
                                       0.336 0.736891
                                     -1.448 0.147646
## rm_new
                -1.395547
                            0.963844
## dis_new
                -2.328906
                            0.475160 -4.901 9.52e-07 ***
## zn_new1
                 0.296890
                            0.802123
                                      0.370 0.711285
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 645.88 on 465 degrees of freedom
## Residual deviance: 167.31 on 452 degrees of freedom
## AIC: 195.31
##
## Number of Fisher Scoring iterations: 9
##
## target FALSE TRUE
            235
##
        0
                   2
##
        1
             34
                 195
```

3.1 Model two with backward step function

```
stepmodel2<- step(model2, direction="backward")</pre>
```

```
## Start: AIC=195.31
```

```
## target ~ (zn + indus + chas + nox + rm + age + dis + rad + tax +
      ptratio + black + lstat + medv + tax_new + medv_new + lstat_new +
      rm_new + dis_new + zn_new) - zn - rm - dis - tax - lstat -
##
##
      medv
##
              Df Deviance
##
                            AIC
## - indus
             1 167.35 193.35
## - lstat new 1 167.43 193.43
## - zn_new
             1
                  167.45 193.45
## - chas
               1 167.60 193.60
## <none>
                  167.31 195.31
## - rm_new
               1 169.44 195.44
             1 170.33 196.33
## - tax_new
## - black
              1 172.33 198.33
## - age
               1 175.88 201.88
## - ptratio
               1
                  176.18 202.18
## - medv_new
                  180.15 206.15
               1
               1 199.36 225.36
## - dis new
               1
## - rad
                  200.70 226.70
               1
## - nox
                  257.91 283.91
##
## Step: AIC=193.35
## target ~ chas + nox + age + rad + ptratio + black + tax_new +
      medv new + lstat new + rm new + dis new + zn new
##
              Df Deviance AIC
## - zn_new
              1 167.47 191.47
                  167.47 191.47
## - lstat_new 1
               1 167.72 191.72
## - chas
## <none>
                  167.35 193.35
               1 169.45 193.45
## - rm_new
## - tax_new
              1 170.82 194.82
               1 172.40 196.40
## - black
## - age
               1 175.88 199.88
                 176.20 200.20
## - ptratio
              1
## - medv_new 1 180.20 204.20
## - dis new
               1 201.51 225.51
## - rad
               1
                  207.02 231.02
## - nox
                  269.29 293.29
               1
##
## Step: AIC=191.46
## target ~ chas + nox + age + rad + ptratio + black + tax_new +
      medv_new + lstat_new + rm_new + dis_new
##
              Df Deviance
                  167.72 189.72
## - lstat_new 1
                  167.76 189.76
## - chas
               1
## <none>
                  167.47 191.47
## - rm_new
               1 169.49 191.49
               1 170.94 192.94
## - tax_new
## - black
               1 172.41 194.41
## - age
              1 176.02 198.02
## - ptratio
            1 178.47 200.47
## - medv new 1 180.23 202.23
```

```
201.58 223.58
## - dis new
             1
## - rad
                  207.88 229.88
               1
## - nox
             1 273.49 295.49
##
## Step: AIC=189.72
## target ~ chas + nox + age + rad + ptratio + black + tax_new +
      medv_new + rm_new + dis_new
##
##
             Df Deviance
                           AIC
## - chas
            1 168.12 188.12
## <none>
                 167.72 189.72
## - rm_new
              1 171.01 191.01
             1 171.06 191.06
## - tax_new
## - black
              1 172.58 192.58
## - ptratio
              1 178.82 198.82
## - age
              1 179.03 199.03
## - medv_new 1 180.24 200.24
## - dis_new 1 201.70 221.70
## - rad
              1 208.38 228.38
              1 273.77 293.77
## - nox
##
## Step: AIC=188.11
## target ~ nox + age + rad + ptratio + black + tax_new + medv_new +
      rm_new + dis_new
##
##
             Df Deviance
                           AIC
## <none>
                 168.12 188.12
## - tax_new
            1 171.58 189.58
             1 171.61 189.61
## - rm_new
## - black
              1 172.85 190.85
              1 178.87 196.87
## - ptratio
## - age
              1 180.79 198.79
## - medv_new 1 181.00 199.00
## - dis_new
              1 203.04 221.04
                 210.44 228.44
## - rad
              1
## - nox
                 273.82 291.82
              1
pre_train2_step<-predict(stepmodel2,type="response")</pre>
table(target,pre_train2_step >0.75)
##
## target FALSE TRUE
##
       0
           235
##
       1
            34 195
```