141xp q1 modeling

Karishma Raghuram

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```
#run logit model for AHI

dataset <- read.csv("Jan to Mar15 2023.csv")
head(dataset)</pre>
```

```
##
     Selected
                      RecordNo
                                         Recording.Date Gender.Male.Female. Height
            O XBDYM3BFZCOAQGB 6.7407
                                         1/3/2023 21:08
                                                                      female
                                                                               116.5
## 2
            O XBDYM3BFZCOCIVD 31.9870
                                         1/4/2023 21:22
                                                                      female
                                                                                62.0
                                                                                67.0
## 3
            O XBDYM3BFZCOGFDS 21.8020
                                         1/6/2023 22:49
                                                                         male
## 4
            0 XBDYM3BFZC0I5IJ 4.6271
                                                                                43.0
                                         1/7/2023 21:11
                                                                         male
## 5
            O XBDYM3BFZCOK2BT
                               7.0775
                                        1/8/2023 21:57
                                                                        male
                                                                                49.0
## 6
            O XBDYM3BFZCONPIO 55.2130 1/10/2023 22:30
                                                                      female
                                                                                70.5
##
     HeightUnit Weight WeightUnit
                                       BMI ESS
                                                     AHI AHI.REM Apnea.Counts
## 1
                     29
                                kg 21.367
                                                1.01690
                                                          2.2222
## 2
             in
                    120
                                lb 21.948 999
                                                3.33330
                                                          8.0672
                                                                             9
## 3
                    325
                                1b 50.903
                                            12 12.92000
                                                          3.8532
                                                                            14
## 4
                     53
                                                                             6
             in
                                1b 20.153
                                             0
                                                1.76710
                                                          3.4286
                                                                             2
## 5
             in
                     52
                                lb 15.227 999
                                                0.86538
                                                          4.7059
## 6
             in
                    335
                                1b 47.388
                                                8.31890
                                                         3.2432
                                            23
     Apnea.Counts.REM Latency.to.Sleep.Onset Latency.to.REM Desats.LT.90
##
## 1
                     0
                                           6.0
                                                         160.5
                                                                           0
## 2
                     3
                                          29.5
                                                         248.5
                                                                          10
## 3
                                          20.5
                                                         123.0
                                                                           8
                     1
## 4
                     0
                                          70.0
                                                         152.0
                                                                           1
## 5
                     1
                                           3.5
                                                                           4
                                                         223.5
                     1
                                           0.5
                                                         323.0
                                                                          66
##
     Desats.LT.80 Desats.LT.70 PLM.Total Sleep.Eff.Index Record.Type
## 1
                0
                              0
                                         0
                                                    80.546
                                                              PSG+TcC02
                                                              PSG+TcC02
## 2
                 0
                              0
                                         0
                                                    89.362
## 3
                 0
                              0
                                         0
                                                    85.606
                                                                  Split
                              0
                                         0
## 4
                 0
                                                    82.269
                                                              PSG+TcC02
## 5
                 3
                              2
                                         3
                                                    96.185
                                                              PSG+TcC02
                                        15
## 6
                                                    80.699
                                                                   BPAP
##
## 1
                                                                        Possible sinus arrhythmia. Sinus r
## 2
                                         Possible accelerated junctional rhythm. Inverted P waves noted
## 3
                                                                                NSR with varying rate and p
## 4
                                                                                                    NSR with
## 6 NSR with possible PVCs and PACs. Please review EKG in epoch# 19, 35, 52, 61, 78, 110, 155, 183, 22
                                 Sleep.Generic11. Sleep.Generic20. LEG1.Index
## 1
                             Flat with 2 pillows.
                                                                        0.084746
                                                                None
```

```
## 2
                           Flat with 2 pillows.
                                                             N/A
                                                                   0.000000
## 3
                          Flat with one pillow.
                                                            N/A
                                                                   0.000000
                             Flat with 1 pillow
## 4
                                                            <NA>
                                                                   0.000000
## 5
                      HOB flat with one pillow.
                                                            N/A
                                                                   0.216350
## 6 Leveled with one pillow and one body pillow
                                                            N/A 20.901000
## LEG2.Index
                                            Scorer
## 1 0.084746
                                   Alfonso Padilla
## 2 0.000000
                                     Joy Nishihira
## 3 0.000000 Weiguang Zhong : Neurotronics, Inc.
## 4 0.000000 Weiguang Zhong : Neurotronics, Inc.
## 5 0.649040
                                   Alfonso Padilla
## 6 17.470000
                       Gabriela Ortiz : UCLA Sleep
#IF RECORD ID IS THE SAME, REMOVE DUPLICATE!!!!!!!!
#DONT FORGET
dataset<-dataset[!duplicated(dataset$RecordNo),]</pre>
#load packages
#library(readxl)
#library(magrittr)
#install.packages("pastecs")
#library(pastecs)
#install.packages("gridExtra")
#library(gridExtra)
#library(qqplot2)
#library(dplyr)
#install.packages("DT")
#library(DT)
#library(MASS)
#install.packages("leaps")
#library(leaps)
#install.packages("qlmnet")
library(glmnet)
## Loading required package: Matrix
## Loaded glmnet 4.1-7
#install.packages("PerformanceAnalytics")
#library(PerformanceAnalytics)
#install.packages("corrr")
#library(corrr)
#install.packages("tidyr")
#library(tidyr)
#remove useless vars
dataset < -dataset[,c(-1,-2,-4,-22,-23,-24,-25,-26,-29)]
head(dataset)
##
        Age Gender.Male.Female. Height HeightUnit Weight WeightUnit
                                                                       BMI ESS
## 1 6.7407
                        female 116.5
                                                               kg 21.367
## 2 31.9870
                        female 62.0
                                                     120
                                                               lb 21.948 999
                                              in
```

```
## 3 21.8020
                                     67.0
                                                          325
                                                                      lb 50.903 12
                              male
                                                   in
                                                          53
## 4 4.6271
                              male
                                     43.0
                                                   in
                                                                      lb 20.153
                                                                                   0
## 5 7.0775
                                     49.0
                                                          52
                              male
                                                   in
                                                                      lb 15.227 999
## 6 55.2130
                           female
                                     70.5
                                                         335
                                                                      1b 47.388 23
                                                   in
          AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
## 1 1.01690 2.2222
                                   0
                                                     0
## 2 3.33330 8.0672
                                   9
                                                     3
                                                                           29.5
## 3 12.92000 3.8532
                                  14
                                                     1
                                                                           20.5
## 4 1.76710
               3.4286
                                   6
                                                     0
                                                                           70.0
## 5 0.86538 4.7059
                                   2
                                                     1
                                                                            3.5
## 6 8.31890 3.2432
                                   3
                                                     1
                                                                            0.5
     Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
##
## 1
               160.5
                                 0
                                               0
                                                             0
                                                                           0.084746
## 2
                                               0
               248.5
                                10
                                                             0
                                                                       0
                                                                           0.000000
## 3
               123.0
                                 8
                                               0
                                                             0
                                                                       0
                                                                           0.000000
## 4
               152.0
                                 1
                                               0
                                                             0
                                                                       0
                                                                           0.000000
## 5
               223.5
                                 4
                                               3
                                                             2
                                                                       3
                                                                           0.216350
                                               0
                                                             0
## 6
               323.0
                                66
                                                                      15
                                                                           20.901000
##
     LEG2.Index
## 1
       0.084746
## 2
       0.000000
## 3
       0.000000
## 4
       0.000000
## 5
       0.649040
## 6 17.470000
#FIX WEIGHT AND HEIGHT TO BE SAME BASIS
#weight
for(i in 1:nrow(dataset)){
  if(dataset[i,"WeightUnit"] == "kg"){
    weight_kg<-dataset[i,"Weight"]</pre>
    weight_kg<- weight_kg*2.20462262185
    dataset[i,"Weight"] <- weight_kg</pre>
    dataset[i, "WeightUnit"]<-"lb"</pre>
  }
}
#height
for(i in 1:nrow(dataset)){
  if(dataset[i,"HeightUnit"] == "cm"){
    height_cm<-dataset[i, "Height"]
    height_cm<- height_cm / 2.54
    dataset[i,"Height"] <-height_cm</pre>
    dataset[i, "HeightUnit"]<-"in"</pre>
  }
}
#make gender a binary variable
for(i in 1:nrow(dataset)){
  if(dataset[i, "Gender.Male.Female."] == "female"){
    #make female coded for 1
    dataset[i, "Gender.Male.Female."]<-1</pre>
  }
  else{
```

```
#make male coded for O
    dataset[i,"Gender.Male.Female."]<-0</pre>
  }
}
head(dataset)
##
         Age Gender.Male.Female.
                                   Height HeightUnit
                                                         Weight WeightUnit
                                                                               BMI
## 1 6.7407
                               1 45.86614
                                                   in 63.93406
                                                                         lb 21.367
## 2 31.9870
                                1 62.00000
                                                                         lb 21.948
                                                   in 120.00000
## 3 21.8020
                                0 67.00000
                                                   in 325.00000
                                                                         1b 50.903
## 4 4.6271
                                0 43.00000
                                                   in 53.00000
                                                                         lb 20.153
                                                   in 52.00000
## 5 7.0775
                               0 49.00000
                                                                         lb 15.227
## 6 55.2130
                                1 70.50000
                                                   in 335.00000
                                                                         1b 47.388
##
     ESS
              AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
       0 1.01690 2.2222
                                      0
                                                                             6.0
## 2 999 3.33330 8.0672
                                      9
                                                                            29.5
                                                       3
## 3 12 12.92000 3.8532
                                     14
                                                       1
                                                                            20.5
                                      6
                                                       0
                                                                            70.0
     0 1.76710 3.4286
## 5 999 0.86538 4.7059
                                      2
                                                       1
                                                                             3.5
## 6 23 8.31890 3.2432
                                      3
                                                                             0.5
                                                       1
    Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
## 1
                              0
              160.5
                                             0
                                                          0
                                                                     0
                                                                         0.084746
## 2
              248.5
                              10
                                             0
                                                          0
                                                                         0.000000
## 3
              123.0
                               8
                                             0
                                                          0
                                                                     0
                                                                         0.000000
## 4
              152.0
                               1
                                             0
                                                          0
                                                                    0
                                                                         0.000000
                                                          2
## 5
                               4
                                             3
                                                                    3
              223.5
                                                                         0.216350
## 6
              323.0
                               66
                                             0
                                                          0
                                                                    15 20.901000
    LEG2.Index
##
## 1
       0.084746
## 2
       0.000000
## 3
       0.000000
## 4
       0.000000
## 5
       0.649040
## 6 17.470000
#remove NAs
dataset<- na.omit(dataset)</pre>
#split 80/20 training/testing
set.seed(12345)
test_i<-sample(1:nrow(dataset), (nrow(dataset)*(0.2)), replace=F)</pre>
training<-dataset[-test_i,]</pre>
testing<-dataset[test_i,]</pre>
#assign y var
y<-dataset$AHI
head(y)
```

[1] 1.01690 3.33330 12.92000 1.76710 0.86538 8.31890

length(y)

[1] 400

```
#make the AHI var into a binary outcome var
for(i in 1:length(y)){
   if(y[i]>30){
      #make AHI of 30 & above coded for 1
      #one indicates abnormal AHI
      y[i]<-1
   }
   else{
      #make AHI of below 30 coded for 0
      #zero indicates abnormal AHI
      y[i]<-0
   }
}</pre>
```

[1] 0 0 0 0 0 0

```
#remove y var from predictors list
x<-dataset[,-9]
head(x)</pre>
```

```
Height HeightUnit
        Age Gender.Male.Female.
                                                      Weight WeightUnit
                                                                            BMI
## 1 6.7407
                              1 45.86614
                                                 in 63.93406
                                                                      lb 21.367
## 2 31.9870
                              1 62.00000
                                                 in 120.00000
                                                                      lb 21.948
## 3 21.8020
                                                                      1b 50.903
                              0 67.00000
                                                 in 325.00000
## 4 4.6271
                              0 43.00000
                                                 in 53.00000
                                                                      1b 20.153
## 5 7.0775
                              0 49.00000
                                                 in 52.00000
                                                                      lb 15.227
## 6 55.2130
                              1 70.50000
                                                 in 335.00000
                                                                      1b 47.388
    ESS AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
      0 2.2222
                                            0
                                                                 6.0
## 1
                   0
## 2 999 8.0672
                           9
                                            3
                                                                29.5
## 3 12 3.8532
                          14
                                            1
                                                                20.5
                                            0
## 4 0 3.4286
                           6
                                                                70.0
## 5 999 4.7059
                           2
                                                                 3.5
## 6 23 3.2432
                           3
                                                                 0.5
                                            1
   Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
## 1
             160.5
                              0
                                           0
                                                        0
                                                                  0
                                                                      0.084746
## 2
             248.5
                             10
                                           0
                                                        0
                                                                  0
                                                                      0.000000
## 3
             123.0
                              8
                                           0
                                                        0
                                                                  0
                                                                      0.000000
## 4
                              1
                                           0
                                                        0
                                                                  0
                                                                      0.000000
             152.0
                                                        2
## 5
             223.5
                              4
                                           3
                                                                 3
                                                                      0.216350
## 6
             323.0
                             66
                                           0
                                                        0
                                                                 15 20.901000
##
   LEG2.Index
## 1
    0.084746
## 2
      0.000000
## 3 0.000000
```

```
## 4  0.000000
## 5  0.649040
## 6  17.470000

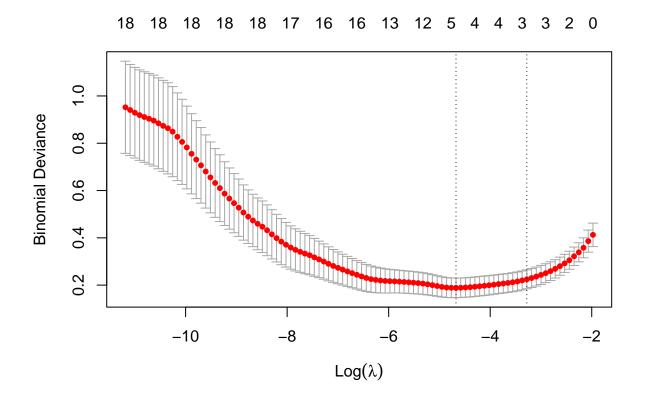
x<-data.matrix(x)

#run lasso regression
cv_model <- cv_glmnet(x=x, y=y, family = "binomial", alpha = 1)

best_lambda <- cv_model$lambda.min
best_lambda

## [1] 0.009341045

plot(cv_model)</pre>
```



```
## Height
## HeightUnit
## Weight
## WeightUnit
## BMI
## ESS
## AHI.REM
                          0.035833053
                          0.019438905
## Apnea.Counts
## Apnea.Counts.REM
## Latency.to.Sleep.Onset .
## Latency.to.REM
                          0.001665326
## Desats.LT.90
                          0.019580822
## Desats.LT.80
                         -0.088601169
## Desats.LT.70
## PLM.Total
## LEG1.Index
## LEG2.Index
#assign y var
y.test<-testing$AHI
head(y.test)
## [1] 0.0000 5.3282 2.0896 6.3736 4.9315 1.4795
length(y.test)
## [1] 80
#remove y var from predictors list
x.train<-testing[,-9]</pre>
head(x.train)
          Age Gender.Male.Female. Height HeightUnit Weight WeightUnit
                                                                        BMI ESS
## 142 31.3270
                                1 66.00
                                                       125
                                                                  lb 20.176
                                           in
                                               in
## 51
       6.8256
                                0 47.24
                                                       50
                                                                  lb 15.753
## 208 28.1570
                                1 63.00
                                               in
                                                      170
                                                                  lb 30.114
## 218 60.6010
                                0 72.00
                                               in
                                                       225
                                                                  lb 30.516
## 220 65.4880
                                1 62.00
                                                in
                                                       150
                                                                  1b 27.436
                                                       210
## 152 64.7790
                                0 72.00
                                                 in
                                                                  lb 28.481
      AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset Latency.to.REM
## 142 0.0000
                         0
                                          0
                                                              24.5
                                                                           183.5
                                          7
## 51 12.4140
                        16
                                                              42.0
                                                                            91.0
## 208 4.6154
                         0
                                          0
                                                              1.5
                                                                            67.0
                                          0
## 218 18.9470
                         1
                                                              13.0
                                                                           129.0
```

0

0

0

0

0

0

0

0

Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index LEG2.Index

4.5

0.0

3 1.28460

0

0

8

1

0.00000

2.01490

1.09890

9.04110

0.65753

87.0

38.0

1.7380

0.0000

2.7612

2.5275

9.2877

1.3151

220 6.8571

152 4.4681

142

51

208

218

220

152

0

2

0

0

0

0

0

0

0

5

1

16

0

4

```
x.train<-data.matrix(x.train)</pre>
new<-x.train
y_predicted <- predict(best_model, s = best_lambda, newx = new)</pre>
#find SST and SSE
sst <- sum((y.test - mean(y.test))^2)</pre>
sse <- sum((y_predicted - y.test)^2)</pre>
#find R-Squared
rsq <- 1 - sse/sst
rsq
## [1] -0.9771527
logit_data<-dataset
for(i in 1:nrow(logit_data)){
  if(logit_data[i,"AHI"]>30){
    #make AHI of 30 & above coded for 1
    #one indicates abnormal AHI
   logit_data[i,"AHI"]<-1</pre>
  }
  else{
    #zero indicates abnormal AHI
    logit_data[i,"AHI"]<-0</pre>
 }
}
mod.logit <- glm(AHI~AHI.REM+Apnea.Counts+Latency.to.REM+Desats.LT.90+Desats.LT.70, data = logit_data,
print(summary(mod.logit))
##
## Call:
## glm(formula = AHI ~ AHI.REM + Apnea.Counts + Latency.to.REM +
##
       Desats.LT.90 + Desats.LT.70, family = "binomial", data = logit_data)
##
## Deviance Residuals:
##
       Min
                   1Q
                         Median
                                       3Q
                                                Max
## -2.13615 -0.12778 -0.07778 -0.05669
                                            2.72940
##
## Coefficients:
##
                  Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                 -7.277474 1.162164 -6.262 3.80e-10 ***
                  0.045761 0.013895 3.293 0.00099 ***
## AHI.REM
                                        2.752 0.00592 **
## Apnea.Counts
                  0.025994
                             0.009446
## Latency.to.REM 0.006182 0.003845 1.608 0.10785
## Desats.LT.90 0.031256
                            0.007407
                                       4.220 2.44e-05 ***
## Desats.LT.70 -0.199332
                              0.072074 -2.766 0.00568 **
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
```

(Dispersion parameter for binomial family taken to be 1)

```
##
      Null deviance: 164.65 on 399 degrees of freedom
## Residual deviance: 54.12 on 394 degrees of freedom
## AIC: 66.12
## Number of Fisher Scoring iterations: 8
#run qlm model
head(training)
         Age Gender.Male.Female.
                                  Height HeightUnit
                                                        Weight WeightUnit
                                                                             BMI
                              1 45.86614
                                          in 63.93406
                                                                       lb 21.367
## 1 6.7407
## 2 31.9870
                               1 62.00000
                                                  in 120.00000
                                                                       lb 21.948
## 3 21.8020
                               0 67.00000
                                                  in 325.00000
                                                                       1b 50.903
## 4 4.6271
                               0 43.00000
                                                  in 53.00000
                                                                       lb 20.153
## 6 55.2130
                               1 70.50000
                                                 in 335.00000
                                                                       1b 47.388
## 8 16.1700
                               0 61.00000
                                                  in 83.00000
                                                                       lb 15.683
     ESS
            AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
## 1
         1.0169 2.2222
                                   0
                                                     0
       0
## 2 999 3.3333 8.0672
                                   9
                                                     3
                                                                         29.5
## 3 12 12.9200 3.8532
                                  14
                                                     1
                                                                         20.5
      0 1.7671
                 3.4286
                                    6
                                                     0
                                                                         70.0
## 6 23 8.3189 3.2432
                                    3
                                                     1
                                                                          0.5
      0 1.8426 4.4444
                                    0
                                                     0
    Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
## 1
              160.5
                              0
                                            0
                                                         0
                                                                   0
                                                                       0.084746
## 2
              248.5
                              10
                                            0
                                                         0
                                                                       0.000000
## 3
              123.0
                              8
                                           0
                                                         0
                                                                       0.000000
## 4
              152.0
                                           0
                                                         0
                              1
                                                                   0
                                                                       0.000000
## 6
              323.0
                              66
                                           0
                                                         0
                                                                  15 20.901000
                                           0
                                                         0
## 8
              204.0
                              3
                                                                  1
                                                                       2.188100
    LEG2.Index
## 1
      0.084746
## 2
      0.000000
## 3
      0.000000
## 4
      0.000000
## 6
    17.470000
## 8
      1.957800
head(testing)
          Age Gender.Male.Female. Height HeightUnit Weight WeightUnit
                                                                          BMI ESS
## 142 31.3270
                                 1 66.00
                                                  in
                                                        125
                                                                    lb 20.176
                                                                                2
## 51
       6.8256
                                  47.24
                                                         50
                                                                    lb 15.753
                                                  in
## 208 28.1570
                                 1 63.00
                                                        170
                                                                    lb 30.114
                                                                                7
                                                  in
## 218 60.6010
                                 0
                                    72.00
                                                  in
                                                        225
                                                                    lb 30.516
## 220 65.4880
                                 1 62.00
                                                        150
                                                  in
                                                                    1b 27.436
## 152 64.7790
                                 0 72.00
                                                        210
                                                  in
          AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
## 142 0.0000 0.0000
                               0
## 51 5.3282 12.4140
                               16
                                                  7
                                                                      42.0
```

0

0

1.5

13.0

0

1

208 2.0896 4.6154

218 6.3736 18.9470

```
## 220 4.9315 6.8571
                                                                        4.5
## 152 1.4795 4.4681
                                 2
                                                  0
                                                                        0.0
       Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
                                                                           1.28460
## 142
              183.5
                                 0
                                              0
                                                           0
## 51
                91.0
                                 5
                                              0
                                                           0
                                                                      0
                                                                           0.00000
## 208
                67.0
                                1
                                              0
                                                           0
                                                                      0
                                                                           2.01490
## 218
               129.0
                               16
                                              0
                                                                     1
                                                                           1.09890
## 220
                87.0
                                                           0
                                                                     7
                                0
                                              0
                                                                           9.04110
## 152
                 38.0
                                 4
                                              0
                                                           0
                                                                           0.65753
##
       LEG2.Index
## 142
           1.7380
           0.0000
## 51
## 208
           2.7612
## 218
           2.5275
## 220
           9.2877
## 152
           1.3151
#make the AHI var into a binary outcome var
for(i in 1:nrow(training)){
  if(training[i,"AHI"]>30){
    #make AHI of 30 & above coded for 1
    #one indicates abnormal AHI
   training[i,"AHI"]<-1</pre>
 }
 else{
    #make AHI of below 30 coded for 0
    #zero indicates abnormal AHI
    training[i,"AHI"]<-0</pre>
 }
}
head(training)
                                   Height HeightUnit
##
         Age Gender.Male.Female.
                                                        Weight WeightUnit
                                                                              BMI
## 1 6.7407
                               1 45.86614
                                                 in 63.93406
                                                                        lb 21.367
## 2 31.9870
                               1 62.00000
                                                  in 120.00000
                                                                        lb 21.948
## 3 21.8020
                               0 67.00000
                                                  in 325.00000
                                                                        1b 50.903
## 4 4.6271
                               0 43.00000
                                                  in 53.00000
                                                                       lb 20.153
## 6 55.2130
                               1 70.50000
                                                  in 335.00000
                                                                       lb 47.388
## 8 16.1700
                               0 61.00000
                                                  in 83.00000
                                                                        lb 15.683
    ESS AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
## 1
       0
           0 2.2222
                         0
                                                 0
                                                                      6.0
## 2 999
           0 8.0672
                                9
                                                 3
                                                                      29.5
           0 3.8532
## 3 12
                               14
                                                                      20.5
                                                 1
## 4
       0
           0 3.4286
                                6
                                                 0
                                                                      70.0
    23
                                3
## 6
           0 3.2432
                                                 1
                                                                      0.5
## 8
           0 4.4444
                                0
                                                 0
                                                                      85.5
   Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
## 1
                               0
              160.5
                                            0
                                                         0
                                                                       0.084746
## 2
              248.5
                              10
                                            0
                                                         0
                                                                        0.000000
## 3
              123.0
                               8
                                                         0
                                                                   0
                                                                        0.000000
                                            0
## 4
              152.0
                               1
                                            0
                                                         0
                                                                   0
                                                                        0.000000
## 6
                              66
                                            0
                                                         0
                                                                   15 20.901000
              323.0
## 8
              204.0
                              3
                                            0
                                                         0
                                                                        2.188100
##
   LEG2.Index
```

```
0.084746
## 1
## 2
      0.000000
## 3
       0.000000
## 4
       0.000000
## 6 17.470000
## 8
      1.957800
#make the AHI var into a binary outcome var
for(i in 1:nrow(testing)){
  if(testing[i,"AHI"]>30){
    #make AHI of 30 & above coded for 1
    #one indicates abnormal AHI
    testing[i,"AHI"]<-1
  }
  else{
    #make AHI of below 30 coded for 0
    #zero indicates abnormal AHI
    testing[i,"AHI"]<-0</pre>
  }
}
head(testing)
           Age Gender.Male.Female. Height HeightUnit Weight WeightUnit
                                                                            BMI ESS
## 142 31.3270
                                  1 66.00
                                                          125
                                                                      lb 20.176
## 51
        6.8256
                                  0 47.24
                                                           50
                                                                      lb 15.753
                                                    in
                                                                                   0
## 208 28.1570
                                  1 63.00
                                                    in
                                                          170
                                                                      lb 30.114
## 218 60.6010
                                  0 72.00
                                                          225
                                                    in
                                                                      lb 30.516
## 220 65.4880
                                  1 62.00
                                                    in
                                                          150
                                                                      1b 27.436
                                                                                   8
## 152 64.7790
                                  0 72.00
                                                    in
                                                          210
                                                                      lb 28.481
       AHI AHI.REM Apnea.Counts Apnea.Counts.REM Latency.to.Sleep.Onset
## 142
         0 0.0000
                               0
## 51
         0 12.4140
                              16
                                                7
                                                                     42.0
## 208
        0 4.6154
                               0
                                                0
                                                                      1.5
## 218
        0 18.9470
                               1
                                                0
                                                                     13.0
                                                0
## 220
         0 6.8571
                               0
                                                                      4.5
## 152
         0 4.4681
                               2
                                                0
                                                                      0.0
       Latency.to.REM Desats.LT.90 Desats.LT.80 Desats.LT.70 PLM.Total LEG1.Index
## 142
                183.5
                                  0
                                               0
                                                             0
                                                                       3
                                                                             1.28460
## 51
                 91.0
                                  5
                                               0
                                                             0
                                                                       0
                                                                             0.00000
## 208
                 67.0
                                  1
                                               0
                                                            0
                                                                       0
                                                                             2.01490
                                                             0
## 218
                129.0
                                 16
                                               0
                                                                            1.09890
## 220
                 87.0
                                  0
                                               0
                                                             0
                                                                       7
                                                                             9.04110
## 152
                 38.0
                                  4
                                               0
                                                             0
                                                                            0.65753
##
       LEG2.Index
## 142
           1.7380
## 51
           0.0000
## 208
           2.7612
## 218
           2.5275
## 220
           9.2877
## 152
           1.3151
#assign y var
```

```
testing.y<-testing$AHI
#head(testing.y)
#length(y)
#remove y var from predictors list
testing.x<-testing[,-9]
#head(testing.x)
mod.logit <- glm(factor(AHI)~AHI.REM+Apnea.Counts+Latency.to.REM+Desats.LT.90+Desats.LT.70, data = train
print(summary(mod.logit))
##
## Call:
## glm(formula = factor(AHI) ~ AHI.REM + Apnea.Counts + Latency.to.REM +
      Desats.LT.90 + Desats.LT.70, family = "binomial", data = training)
##
## Deviance Residuals:
##
       Min
                  10
                        Median
                                     3Q
                                              Max
## -1.44847 -0.05361 -0.02727 -0.01413
                                          2.93912
##
## Coefficients:
##
                   Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                 -11.194471 2.625531 -4.264 2.01e-05 ***
                   ## AHI.REM
## Apnea.Counts
                   0.018872 0.011362
                                       1.661 0.096705 .
## Latency.to.REM 0.016244 0.006158 2.638 0.008339 **
## Desats.LT.90 0.041957 0.012282 3.416 0.000636 ***
## Desats.LT.70 -0.257562 0.101386 -2.540 0.011072 *
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 114.998 on 319 degrees of freedom
##
## Residual deviance: 24.254 on 314 degrees of freedom
## AIC: 36.254
##
## Number of Fisher Scoring iterations: 9
pred.y <- predict(mod.logit,newdata = testing.x, type = "response")</pre>
pred.y \leftarrow ifelse(pred.y > 30, 1, 0)
table(pred.y,testing.y)
##
        testing.y
## pred.y 0 1
##
       0 73 7
1-mean(pred.y != testing.y) # Accuracy rate
```

[1] 0.9125

```
pred_df<-data.frame(data=pred.y)</pre>
# b.
summary(mod.logit)
##
## Call:
## glm(formula = factor(AHI) ~ AHI.REM + Apnea.Counts + Latency.to.REM +
      Desats.LT.90 + Desats.LT.70, family = "binomial", data = training)
##
## Deviance Residuals:
       Min
                  1Q
                        Median
                                     3Q
                                              Max
## -1.44847 -0.05361 -0.02727 -0.01413
                                          2.93912
##
## Coefficients:
##
                   Estimate Std. Error z value Pr(>|z|)
                 -11.194471 2.625531 -4.264 2.01e-05 ***
## (Intercept)
## AHI.REM
                   0.068457
                            0.025395 2.696 0.007024 **
## Apnea.Counts
                   ## Latency.to.REM 0.016244
                            0.006158 2.638 0.008339 **
## Desats.LT.90
                             0.012282 3.416 0.000636 ***
                 0.041957
## Desats.LT.70
                  -0.257562
                            0.101386 -2.540 0.011072 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 114.998 on 319 degrees of freedom
## Residual deviance: 24.254 on 314 degrees of freedom
## AIC: 36.254
##
## Number of Fisher Scoring iterations: 9
#c.
#head(print(training))
pred_y_train <- mod.logit$fitted.values</pre>
pred_y_train <- ifelse(pred_y_train > 30, 1,0)
table(pred_y_train,training$AHI)
##
## pred_y_train 0
##
             0 306 14
1-mean(pred_y_train != training$AHI) # Accuracy rate
## [1] 0.95625
```

#pred_df<-data.frame(data=pred_y_train)</pre>