```
---
title: "ASSIGNMENT 7.1_ThoraricSurgery"
author: "Bhushan Suryawanshi"
date: '2020-07-13'

---
```

For this problem, you will be working with the thoracic surgery data set from the University of California Irvine machine learning repository. This dataset contains information on life expectancy in lung cancer patients after surgery. The underlying thoracic surgery data is in ARFF format. This is a text-based format with information on each of the attributes. You can load this data using a package such as foreign or by cutting and pasting the data section into a CSV file.

Assignment Instructions:

Include all of your answers in a R Markdown report. Here is an example R Markdown report that you can use as a guide.

```r
library("foreign")
thoracic_surgery_df <- read.arff("ThoraricSurgery.arff")
head(thoracic_surgery_df)
```

```
##    DGN PRE4 PRE5 PRE6 PRE7 PRE8 PRE9 PRE10 PRE11 PRE14 PRE17 PRE19 PRE25 PRE30
## 1 DGN2 2.88 2.16 PRZ1    F    F    F     T     T  OC14     F     F     F     T
## 2 DGN3 3.40 1.88 PRZ0    F    F    F     F     F  OC12     F     F     F     T
## 3 DGN3 2.76 2.08 PRZ1    F    F    F     T     F  OC11     F     F     F     T
## 4 DGN3 3.68 3.04 PRZ0    F    F    F     F     F  OC11     F     F     F     F
## 5 DGN3 2.44 0.96 PRZ2    F    T    F     T     T  OC11     F     F     F     T
## 6 DGN3 2.48 1.88 PRZ1    F    F    F     T     F  OC11     F     F     F     F
##   PRE32 AGE Risk1Yr
## 1     F  60       F
## 2     F  51       F
## 3     F  59       F
## 4     F  54       F
## 5     F  73       T
## 6     F  51       F
```

```r
str(thoracic_surgery_df)
```

```
## 'data.frame':    470 obs. of  17 variables:
##  $ DGN    : Factor w/ 7 levels "DGN1","DGN2",..: 2 3 3 3 3 3 3 2 3 3 ...
##  $ PRE4   : num  2.88 3.4 2.76 3.68 2.44 2.48 4.36 3.19 3.16 2.32 ...
##  $ PRE5   : num  2.16 1.88 2.08 3.04 0.96 1.88 3.28 2.5 2.64 2.16 ...
##  $ PRE6   : Factor w/ 3 levels "PRZ0","PRZ1",..: 2 1 2 1 3 2 2 2 3 2 ...
##  $ PRE7   : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 1 1 1 1 ...
##  $ PRE8   : Factor w/ 2 levels "F","T": 1 1 1 1 2 1 1 1 1 1 ...
##  $ PRE9   : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 1 1 1 1 ...
##  $ PRE10  : Factor w/ 2 levels "F","T": 2 1 2 1 2 2 2 2 2 2 ...
##  $ PRE11  : Factor w/ 2 levels "F","T": 2 1 1 1 2 1 1 1 2 1 ...
##  $ PRE14  : Factor w/ 4 levels "OC11","OC12",..: 4 2 1 1 1 1 2 1 1 1 ...
##  $ PRE17  : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 2 1 1 1 ...
##  $ PRE19  : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 1 1 1 1 ...
```

```
##  $ PRE25  : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 1 2 1 1 ...
##  $ PRE30  : Factor w/ 2 levels "F","T": 2 2 2 1 2 1 2 2 2 2 ...
##  $ PRE32  : Factor w/ 2 levels "F","T": 1 1 1 1 1 1 1 1 1 1 ...
##  $ AGE    : num  60 51 59 54 73 51 59 66 68 54 ...
##  $ Risk1Yr: Factor w/ 2 levels "F","T": 1 1 1 1 2 1 2 2 1 1 ...
```

a. Fit a binary logistic regression model to the data set that predicts whether or not the patient survived for one year (the Risk1Y variable) after the surgery. Use the glm() function to perform the logistic regression. See Generalized Linear Models for an example. Include a summary using the summary() function in your results.

```r
library("caTools")
```

```
## Warning: package 'caTools' was built under R version 4.0.2
```

```r
split<-sample.split(thoracic_surgery_df, SplitRatio=0.8)
split
```

```
##  [1]  TRUE  TRUE FALSE  TRUE  TRUE  TRUE  TRUE  TRUE  TRUE FALSE  TRUE  TRUE
## [13] FALSE  TRUE  TRUE  TRUE FALSE
```

```r
train <- subset(thoracic_surgery_df, split="TRUE")
test <- subset(thoracic_surgery_df, split="FALSE")


regression_all_variables<-glm(Risk1Yr ~  DGN + PRE4 + PRE5 + PRE6 + PRE7 + PRE8 + PRE9 + PRE10 +PRE14+ 
summary(regression_all_variables)
```

```
##
## Call:
## glm(formula = Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7 + PRE8 +
##     PRE9 + PRE10 + PRE14 + PRE11 + PRE17 + PRE19 + PRE25 + PRE30 +
##     PRE32 + AGE, family = "binomial", data = train)
##
## Deviance Residuals:
##     Min       1Q   Median       3Q      Max
## -1.6084  -0.5439  -0.4199  -0.2762   2.4929
##
## Coefficients:
##               Estimate Std. Error z value Pr(>|z|)
## (Intercept) -1.655e+01  2.400e+03  -0.007  0.99450
## DGNDGN2      1.474e+01  2.400e+03   0.006  0.99510
## DGNDGN3      1.418e+01  2.400e+03   0.006  0.99528
## DGNDGN4      1.461e+01  2.400e+03   0.006  0.99514
## DGNDGN5      1.638e+01  2.400e+03   0.007  0.99455
## DGNDGN6      4.089e-01  2.673e+03   0.000  0.99988
## DGNDGN8      1.803e+01  2.400e+03   0.008  0.99400
## PRE4        -2.272e-01  1.849e-01  -1.229  0.21909
## PRE5        -3.030e-02  1.786e-02  -1.697  0.08971 .
## PRE6PRZ1    -4.427e-01  5.199e-01  -0.852  0.39448
## PRE6PRZ2    -2.937e-01  7.907e-01  -0.371  0.71030
## PRE7T        7.153e-01  5.556e-01   1.288  0.19788
```

```
## PRE8T        1.743e-01  3.892e-01   0.448  0.65419
## PRE9T        1.368e+00  4.868e-01   2.811  0.00494 **
## PRE10T       5.770e-01  4.826e-01   1.196  0.23185
## PRE14OC12    4.394e-01  3.301e-01   1.331  0.18318
## PRE14OC13    1.179e+00  6.165e-01   1.913  0.05580 .
## PRE14OC14    1.653e+00  6.094e-01   2.713  0.00668 **
## PRE11T       5.162e-01  3.965e-01   1.302  0.19295
## PRE17T       9.266e-01  4.445e-01   2.085  0.03709 *
## PRE19T      -1.466e+01  1.654e+03  -0.009  0.99293
## PRE25T      -9.789e-02  1.003e+00  -0.098  0.92227
## PRE30T       1.084e+00  4.990e-01   2.172  0.02984 *
## PRE32T      -1.398e+01  1.645e+03  -0.008  0.99322
## AGE         -9.506e-03  1.810e-02  -0.525  0.59944
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##     Null deviance: 395.61  on 469  degrees of freedom
## Residual deviance: 341.19  on 445  degrees of freedom
## AIC: 391.19
##
## Number of Fisher Scoring iterations: 15
```

```r
exp(confint(regression_all_variables))
```

```
## Waiting for profiling to be done...

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
```

```
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
```

```
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: algorithm did not converge

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: algorithm did not converge

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: algorithm did not converge

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
```

```
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: algorithm did not converge

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
```

```
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
```

```
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred

## Warning in regularize.values(x, y, ties, missing(ties), na.rm = na.rm):
## collapsing to unique 'x' values

## Warning in regularize.values(x, y, ties, missing(ties), na.rm = na.rm):
## collapsing to unique 'x' values

## Warning in regularize.values(x, y, ties, missing(ties), na.rm = na.rm):
## collapsing to unique 'x' values

##                     2.5 %        97.5 %
## (Intercept)            NA 1.861963e+203
## DGNDGN2     1.717223e-206            NA
## DGNDGN3     8.098224e-207            NA
## DGNDGN4     1.675828e-206            NA
## DGNDGN5     1.264382e-205            NA
```

```
## DGNDGN6      1.041560e-27  6.097954e+20
## DGNDGN8     5.686124e-171            NA
## PRE4         5.499148e-01  1.138007e+00
## PRE5         9.264310e-01  9.993543e-01
## PRE6PRZ1     2.300552e-01  1.783025e+00
## PRE6PRZ2     1.540289e-01  3.470770e+00
## PRE7T        6.558696e-01  5.928649e+00
## PRE8T        7.318681e-01  2.497243e+00
## PRE9T        1.466379e+00  1.007288e+01
## PRE10T       7.094170e-01  4.740878e+00
## PRE14OC12    8.231331e-01  3.022655e+00
## PRE14OC13    9.225453e-01  1.064690e+01
## PRE14OC14    1.540476e+00  1.723680e+01
## PRE11T       7.532542e-01  3.596887e+00
## PRE17T       1.017658e+00  5.900292e+00
## PRE19T                 NA 1.949037e+106
## PRE25T       9.525986e-02  5.459928e+00
## PRE30T       1.197920e+00  8.705307e+00
## PRE32T                 NA 8.570374e+105
## AGE          9.561182e-01  1.026545e+00
```

```r
exp(regression_all_variables$coefficients)
```

```
##  (Intercept)      DGNDGN2      DGNDGN3      DGNDGN4      DGNDGN5      DGNDGN6
## 6.481698e-08 2.511211e+06 1.440574e+06 2.209615e+06 1.301120e+07 1.505091e+00
##      DGNDGN8         PRE4         PRE5     PRE6PRZ1     PRE6PRZ2        PRE7T
## 6.785355e+07 7.967257e-01 9.701510e-01 6.422903e-01 7.454996e-01 2.044884e+00
##        PRE8T        PRE9T       PRE10T    PRE14OC12    PRE14OC13    PRE14OC14
## 1.190456e+00 3.928338e+00 1.780613e+00 1.551720e+00 3.251796e+00 5.222483e+00
##       PRE11T       PRE17T       PRE19T       PRE25T       PRE30T       PRE32T
## 1.675616e+00 2.525890e+00 4.317676e-07 9.067446e-01 2.956473e+00 8.455364e-07
##          AGE
## 9.905394e-01
```

```r
regression_selected_variables<-glm(Risk1Yr ~  DGN + PRE5 + PRE9 + PRE11 + PRE14+ PRE17 + PRE30, data = t
summary(regression_selected_variables)
```

```
##
## Call:
## glm(formula = Risk1Yr ~ DGN + PRE5 + PRE9 + PRE11 + PRE14 + PRE17 +
##     PRE30, family = "binomial", data = train)
##
## Deviance Residuals:
##     Min       1Q   Median       3Q      Max
## -1.4667  -0.5583  -0.4617  -0.2863   2.5340
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  -17.05284 1455.39766  -0.012  0.99065
## DGNDGN2       13.98984 1455.39759   0.010  0.99233
## DGNDGN3       13.47962 1455.39755   0.009  0.99261
## DGNDGN4       13.82213 1455.39761   0.009  0.99242
## DGNDGN5       15.63840 1455.39766   0.011  0.99143
```

```
## DGNDGN6        0.45620 1623.40830   0.000  0.99978
## DGNDGN8       16.91476 1455.39832   0.012  0.99073
## PRE5          -0.02428    0.01731  -1.403  0.16059
## PRE9T          1.35551    0.46854   2.893  0.00382 **
## PRE11T         0.50303    0.33762   1.490  0.13624
## PRE14OC12      0.45340    0.32471   1.396  0.16261
## PRE14OC13      1.31605    0.60232   2.185  0.02889 *
## PRE14OC14      1.77128    0.59355   2.984  0.00284 **
## PRE17T         0.98455    0.43089   2.285  0.02232 *
## PRE30T         1.10136    0.49490   2.225  0.02605 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##     Null deviance: 395.61  on 469  degrees of freedom
## Residual deviance: 346.61  on 455  degrees of freedom
## AIC: 376.61
##
## Number of Fisher Scoring iterations: 14
```

b. According to the summary, which variables had the greatest effect on the survival rate?

Answer As per the summary of the model and the coefficients, PRE9 has highest P-value with positive correlation and we can say PRE9 is having highest impact on the model. Also when reduced variables to the selected variables which are more impactful than others the model also shows reduced AIC which means improved fit. (A larger value of the AIC indicates worse fit (Ref. - Discovering Statistics Using R [@field2012discovering page 388]))

c. To compute the accuracy of your model, use the dataset to predict the outcome variable. The percent of correct predictions is the accuracy of your model. What is the accuracy of your model?

```
#Calculating accuracy for model with all variables
result <- predict(regression_all_variables, test, type="response")
result <- predict(regression_all_variables, train, type="response")

confusion_matrix <- table(Actual_Value=train$Risk1Yr, Predicted_Value= result >0.5)
confusion_matrix
```

```
##             Predicted_Value
## Actual_Value FALSE TRUE
##            F   390   10
##            T    67    3
```

```
#Accuracy calculation based on confusion matrix
accuracy = (confusion_matrix[[1,1]] + confusion_matrix[[2,2]])/sum(confusion_matrix) * 100
accuracy
```

```
## [1] 83.61702
```

```
#Calculating accuracy for the

result <- predict(regression_selected_variables, test, type="response")
```

```r
result <- predict(regression_selected_variables, train, type="response")

confusion_matrix <- table(Actual_Value=train$Risk1Yr, Predicted_Value= result >0.5)
confusion_matrix
```

```
##             Predicted_Value
## Actual_Value FALSE TRUE
##            F   390   10
##            T    64    6
```

```r
#Accuracy calculation based on confusion matrix
accuracy = (confusion_matrix[[1,1]] + confusion_matrix[[2,2]])/sum(confusion_matrix) * 100
accuracy
```

```
## [1] 84.25532
```

Answer: According to the confusion matrix and accuracy calculation for both the models we can say the best fit model has increased model accuracy by 84.26 - 83.62 = 0.64%.