```
library(readxl)
data <- read_excel("Book1.xlsx")</pre>
library(mice)
#Multivariate Imputation using pmm method
data = data.frame(data)
#all information are true for the following variables
summary(data3)
```

data3\$Short_6 <- TRUE</pre>

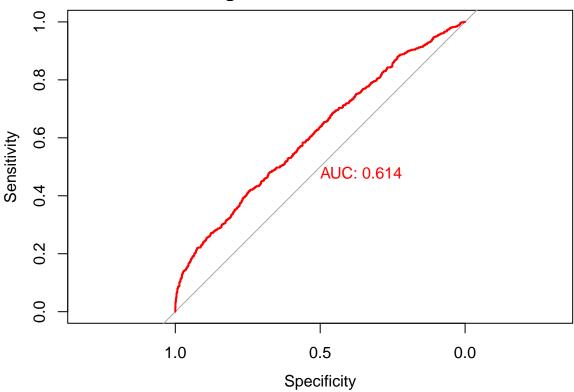
```
##
       Long_1
                       Long_2
                                       Long_3
                                                       Long_4
##
  Min. : 100
                   Min. : 0.000
                                               0
                                                   Min. : 0.0
                                   Min. :
   1st Qu.: 1100
                   1st Qu.: 1.000
                                   1st Qu.:
                                                   1st Qu.: 161.0
## Median : 2300
                   Median : 2.000
                                                   Median : 231.0
                                   Median :
                                               0
## Mean : 2745
                   Mean : 2.823
                                   Mean : 1788
                                                   Mean : 257.4
##
   3rd Qu.: 4100
                   3rd Qu.: 4.000
                                   3rd Qu.: 833
                                                   3rd Qu.: 323.0
  Max. :10000
                   Max. :34.000
                                   Max. :15352
                                                   Max. :1174.0
                        Long_6
##
       Long_5
                                       Long_7
                                                       Long_8
                    Min. : 0.00
## Min. : 0.00
                                   Min. : 0.00
                                                   Min. :
   1st Qu.: 11.00
                    1st Qu.: 2.00
                                   1st Qu.:11.00
                                                   1st Qu.: 3440
  Median : 39.00
                    Median: 4.00
                                   Median :18.00
                                                   Median : 12015
## Mean
         : 66.04
                    Mean : 6.28
                                   Mean
                                          :24.76
                                                   Mean
                                                        : 28475
   3rd Qu.:104.00
                    3rd Qu.: 8.00
                                                   3rd Qu.: 30468
##
                                   3rd Qu.:35.00
                          :87.00
##
  {\tt Max.}
         :686.00
                                   Max.
                                         :97.00
                                                   Max.
                                                          :996223
                    Max.
##
       Long_9
                                        Short_1
                                                        Short_2
                       Long_10
## Min. : 0.000
                     Min. :-10000.0
                                      Mode :logical
                                                       Mode :logical
##
   1st Qu.: 2.000
                     1st Qu.: -346.0 FALSE:2657
                                                       FALSE: 2527
  Median: 3.000
                     Median :
                                 0.0
                                      TRUE :1942
                                                       TRUE :2072
## Mean
         : 5.746
                     Mean
                                78.1
                          :
##
   3rd Qu.: 5.000
                     3rd Qu.:
                                403.0
         :223.000
## Max.
                     Max. : 20000.0
   Short_3
                  Short 4
                                 Short 5
                                                Short 6
                                                               Short 7
## Mode:logical
                  Mode:logical
                                Mode :logical
                                                              Mode :logical
                                                Mode:logical
##
   TRUE:1814
                  TRUE:1836
                                 FALSE:2
                                                TRUE:1836
                                                               FALSE: 144
   NA's:2785
##
                  NA's:2763
                                TRUE :4597
                                                NA's:2763
                                                              TRUE: 4455
##
##
##
##
                                   Short_10
    Short_8
                    Short_9
  Mode :logical
                                  Mode :logical
                   Mode :logical
##
   FALSE:50
                   FALSE:3138
                                  FALSE: 2815
  TRUE :4549
##
                   TRUE :1461
                                  TRUE: 1784
##
##
##
data3$Short_3 <- TRUE</pre>
data3$Short_4 <- TRUE</pre>
```

```
#they are all true, so no useful for modeling
data filled <- data.frame(data[,1:4], data3)</pre>
write.csv(data_filled, file = "data_filled.csv")
train_data <- data_filled[data_filled$TrainVal == "Train_60", ]</pre>
val_data <- data_filled[data_filled$TrainVal == "Val_40", ]</pre>
head(train_data)
     UniqueID submission_year target TrainVal Long_1 Long_2 Long_3 Long_4 Long_5
## 1
       984TAH
                          2015
                                    0 Train_60
                                                  1800
                                                                         221
                                                             6
                                                                    0
                                                                                  0
## 3
       394ETK
                          2015
                                    1 Train 60
                                                   700
                                                                    0
                                                                         147
                                                                                 17
                                                             1
## 4
                                                                    0
                                                                                 187
       036KQK
                          2015
                                                  1700
                                                             2
                                                                         461
                                    0 Train_60
## 5
       996RNP
                          2015
                                    0 Train 60
                                                   600
                                                             3
                                                                    0
                                                                          96
                                                                                  30
## 8
       283LEL
                          2015
                                    0 Train_60
                                                   200
                                                             3
                                                                    0
                                                                         218
                                                                                 190
## 9
       695XKD
                          2015
                                    0 Train_60
                                                  5000
                                                            7
                                                                 8963
                                                                          68
                                                                                  39
     Long_6 Long_7 Long_8 Long_9 Long_10 Short_1 Short_2 Short_3 Short_4 Short_5
                                7
                                                               TRUE
## 1
         15
                 6
                      1575
                                       15
                                             FALSE
                                                      TRUE
                                                                       TRUE
                                                                               TRUE
                                                                               TRUE
## 3
         10
                12
                      9587
                                4
                                     3279
                                             FALSE
                                                      TRUE
                                                               TRUE
                                                                       TRUE
## 4
          6
                 4
                       210
                                2
                                    -2139
                                              TRUE
                                                     FALSE
                                                               TRUE
                                                                       TRUE
                                                                               TRUE
## 5
                 5
         11
                    43650
                                4
                                      316
                                              TRUE
                                                      TRUE
                                                              TRUE
                                                                       TRUE
                                                                               TRUE
## 8
                    34298
                                                               TRUE
          6
                17
                                1
                                        0
                                             FALSE
                                                      TRUE
                                                                       TRUE
                                                                               TRUE
                                      229
## 9
                      6312
                                4
                                              TRUE
                                                      TRUE
                                                               TRUE
                                                                       TRUE
                                                                               TRUE
         26
                34
##
     Short_6 Short_7 Short_8 Short_9 Short_10
## 1
        TRUE
                TRUE
                         TRUE
                                FALSE
                                         FALSE
## 3
        TRUE
                TRUE
                         TRUE
                                FALSE
                                           TRUE
## 4
        TRUE
                TRUE
                         TRUE
                                 TRUE
                                           TRUE
## 5
        TRUE
                TRUE
                         TRUE
                                FALSE
                                         FALSE
## 8
        TRUE
                TRUE
                         TRUE
                                FALSE
                                           TRUE
## 9
        TRUE
               FALSE
                         TRUE
                                FALSE
                                           TRUE
model1 <- glm(target~., data = train_data[,-c(1,4)], family = binomial(link="logit"))</pre>
summary(model1)
##
## Call:
## glm(formula = target ~ ., family = binomial(link = "logit"),
##
       data = train_data[, -c(1, 4)])
##
## Deviance Residuals:
                 1Q
                      Median
                                    3Q
                                             Max
       Min
## -1.8183 -0.7291 -0.6409 -0.4807
                                          2.2067
## Coefficients: (3 not defined because of singularities)
##
                      Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                   -5.284e+01 3.519e+02 -0.150 0.88062
## submission_year 2.012e-02 6.718e-02
                                           0.300 0.76454
                   -4.626e-05 2.689e-05 -1.720 0.08542 .
## Long 1
```

```
## Long_2
                   5.497e-02 1.692e-02
                                          3.248 0.00116 **
                   1.008e-05 1.425e-05 0.707 0.47948
## Long_3
## Long 4
                  -1.005e-03 3.739e-04 -2.687 0.00722 **
## Long_5
                  -1.507e-03 7.274e-04 -2.072 0.03826 *
## Long_6
                  4.174e-02 7.674e-03
                                         5.440 5.34e-08 ***
                  -2.046e-03 2.941e-03 -0.696 0.48658
## Long 7
                  4.194e-08 8.611e-07
                                         0.049 0.96115
## Long 8
                  -1.638e-03 3.456e-03 -0.474 0.63545
## Long_9
## Long_10
                  -1.937e-06 1.343e-05 -0.144 0.88532
## Short_1TRUE
                  -1.859e-02 9.500e-02 -0.196 0.84488
## Short_2TRUE
                  -2.056e-02 9.503e-02 -0.216 0.82871
## Short_3TRUE
                          NA
                                     NA
                                             NA
                                                      NA
## Short_4TRUE
                          NA
                                     NA
                                             NΑ
                                                      NA
## Short_5TRUE
                   1.120e+01 3.247e+02
                                          0.034 0.97248
## Short_6TRUE
                          NA
                                     NA
                                             NA
## Short_7TRUE
                   5.366e-01 3.104e-01
                                          1.729 0.08387 .
## Short_8TRUE
                  -5.451e-01 4.117e-01 -1.324 0.18546
## Short 9TRUE
                  -1.039e-01 1.064e-01 -0.977 0.32881
## Short_10TRUE
                  -1.368e-02 1.006e-01 -0.136 0.89188
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 2986.3 on 2767
                                      degrees of freedom
## Residual deviance: 2854.2 on 2749 degrees of freedom
## AIC: 2892.2
## Number of Fisher Scoring iterations: 11
predict_train <- predict(model1, type = "response")</pre>
predict_class <- round(predict_train )</pre>
confusion_mat_train <- table(predict_class, train_data$target)</pre>
confusion_mat_train
##
## predict_class
                   0
##
              0 2116 593
##
              1
                 15
                      44
library(caret)
#show some measures
confusionMatrix(factor(predict_class), factor(train_data$target), positive = "1")
## Confusion Matrix and Statistics
##
##
            Reference
                0
## Prediction
           0 2116 593
##
```

```
1 15 44
##
##
                  Accuracy : 0.7803
##
##
                    95% CI : (0.7645, 0.7956)
       No Information Rate: 0.7699
##
##
       P-Value [Acc > NIR] : 0.09857
##
##
                     Kappa : 0.091
##
##
    Mcnemar's Test P-Value : < 2e-16
##
##
               Sensitivity: 0.06907
##
               Specificity: 0.99296
            Pos Pred Value: 0.74576
##
##
            Neg Pred Value: 0.78110
                Prevalence: 0.23013
##
##
            Detection Rate: 0.01590
      Detection Prevalence: 0.02132
##
         Balanced Accuracy: 0.53102
##
##
          'Positive' Class : 1
##
##
#ROC curve with auc
library(pROC)
r = roc(train_data$target, predict_train)
plot(r, col = "red", print.auc = TRUE, main = "Logistic ROC for train data")
```

Logistic ROC for train data



```
predict_val <- predict(model1, val_data, type = "response")</pre>
predict_class <- round(predict_val )</pre>
confusion_mat_val <- table(predict_class, val_data$target)</pre>
confusion_mat_val
##
## predict_class
##
                0 1403
                        401
##
                    11
                         16
#show some measures
confusionMatrix(factor(predict_class), factor(val_data$target), positive = "1")
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction
##
            0 1403 401
##
                 11
##
##
                   Accuracy: 0.775
                     95% CI : (0.7552, 0.7939)
##
```

```
No Information Rate: 0.7723
##
       P-Value [Acc > NIR] : 0.4028
##
##
##
                     Kappa: 0.0456
##
    Mcnemar's Test P-Value : <2e-16
##
##
               Sensitivity: 0.038369
##
##
               Specificity: 0.992221
            Pos Pred Value: 0.592593
##
##
            Neg Pred Value: 0.777716
                Prevalence: 0.227744
##
##
            Detection Rate: 0.008738
##
      Detection Prevalence: 0.014746
##
         Balanced Accuracy: 0.515295
##
##
          'Positive' Class : 1
##
```

```
#ROC curve with auc
r2 = roc(val_data$target, predict_val)
plot(r2, col = "red", print.auc = TRUE, main = "Logistic ROC for validation data")
```

Logistic ROC for validation data

