## **Final Project**

2023-05-26

## R Markdown

```
#THIS FILE IS MLR ONLY
FixedAirlineData<-read.csv("CleanAccurate2019.csv")</pre>
x<-FixedAirlineData[c('DEP_DELAY','DEP_TIME','TAXI_OUT','TAXI_IN','ARR_TIME',
'AIR_TIME', 'DISTANCE', 'CARRIER_DELAY',
                       'WEATHER_DELAY', 'NAS_DELAY', 'SECURITY_DELAY',
                       'LATE AIRCRAFT DELAY', 'ARR DELAY', 'ProperDepartureTimes
6',
                       'ProperArrivalTimes6')]
y<-FixedAirlineData[c('ARR_DELAY', 'ProperArrivalTimes6')]</pre>
library(caret)
## Loading required package: ggplot2
## Loading required package: lattice
# Splitting the data into training and test sets
set.seed(122515) # Equivalent to random state in Python
train_indices <- createDataPartition(y, p = 0.7, list = FALSE) # 70% for tra
ining
## Warning in createDataPartition(y, p = 0.7, list = FALSE): Some classes hav
## records ( ) and these will be ignored
## Warning in createDataPartition(y, p = 0.7, list = FALSE): Some classes hav
e a
## single record ( ) and these will be selected for the sample
xtrain <- x[train indices, ]
ytrain <- y[train_indices]</pre>
xtest <- x[-train indices, ]</pre>
ytest <- y[-train_indices]</pre>
# Printing the shapes of the training and test sets
cat("xtrain shape:", dim(xtrain), "\n")
## xtrain shape: 2 15
cat("xtest shape:", dim(xtest), "\n")
## xtest shape: 1027640 15
```

```
cat("ytrain shape:", length(ytrain), "\n")
## ytrain shape: 2
cat("ytest shape:", length(ytest), "\n")
## ytest shape: 2055282
head(train_indices,10)
        Resample1
## [1,]
## [2,]
                 2
head(ytest, 10)
## [1] " -16" " -14" " -25" " -19" " 9" " 3" " -22" " -14" " -7" " -32"
head(ytrain, 10)
## [1] " -1" " -36"
head(xtrain, 10)
     DEP_DELAY DEP_TIME TAXI_OUT TAXI_IN ARR_TIME AIR_TIME DISTANCE CARRIER_D
ELAY
## 1
                     601
                               22
                                         8
                                                722
             1
                                                           51
                                                                   300
0
## 2
                   1359
                               15
                                               1633
                                                          75
                                                                   596
            -5
                                         4
0
     WEATHER_DELAY NAS_DELAY SECURITY_DELAY LATE_AIRCRAFT_DELAY ARR_DELAY
##
## 1
                 0
                            0
                                                                 0
                                                                          -1
                  0
                            0
                                                                 0
## 2
                                                                         -36
     ProperDepartureTimes6 ProperArrivalTimes6
## 1
                      06:00
                                           07:23
## 2
                      14:04
                                           17:09
head(xtest, 10)
##
      DEP_DELAY DEP_TIME TAXI_OUT TAXI_IN ARR_TIME AIR_TIME DISTANCE CARRIER_
DELAY
## 3
             -5
                     1215
                                18
                                          6
                                                1329
                                                            50
                                                                    229
0
                     1521
                                                1625
                                                            43
                                                                    223
## 4
             -6
                                14
                                          7
0
## 5
            -15
                     1847
                                18
                                          5
                                                1940
                                                            90
                                                                    579
0
             -7
                      853
                                25
                                          5
                                                 953
                                                            90
                                                                    574
## 6
0
                                                1832
                                                                    341
## 7
             -5
                     1553
                                33
                                         14
                                                            52
0
## 8
             -4
                     1551
                                31
                                          8
                                                1824
                                                           114
                                                                    585
0
```

```
## 9
              -8
                     1037
                                 17
                                                  1239
                                                             101
                                                                      833
0
## 10
                                 15
                                           2
                                                              76
               0
                     1245
                                                  1318
                                                                      533
0
## 11
              -5
                     1410
                                 22
                                           5
                                                  1700
                                                              83
                                                                      533
0
                      557
                                           6
## 12
              -3
                                 10
                                                   737
                                                              84
                                                                      528
0
      WEATHER_DELAY NAS_DELAY SECURITY_DELAY LATE_AIRCRAFT_DELAY ARR_DELAY
##
## 3
                   0
                              0
                                                                             -16
## 4
                   0
                              0
                                              0
                                                                    0
                                                                             -14
## 5
                   0
                              0
                                               0
                                                                    0
                                                                             -25
                              0
                                               0
                                                                    0
## 6
                   0
                                                                             -19
## 7
                   0
                              0
                                               0
                                                                    0
                                                                               9
## 8
                   0
                              0
                                               0
                                                                    0
                                                                               3
                              0
                                               0
                                                                    0
                                                                             -22
## 9
                   0
## 10
                   0
                              0
                                               0
                                                                    0
                                                                             -14
                              0
                                               0
## 11
                   0
                                                                    0
                                                                              -7
                              0
                                                                    0
                                                                             -32
## 12
                   0
##
      ProperDepartureTimes6 ProperArrivalTimes6
## 3
                        12:20
                                             13:45
## 4
                        15:27
                                             16:39
## 5
                        19:02
                                             20:05
## 6
                        09:00
                                             10:12
## 7
                        15:58
                                             18:23
## 8
                        15:55
                                             18:21
## 9
                        10:45
                                             13:01
## 10
                        12:45
                                             13:32
## 11
                        14:15
                                             17:07
## 12
                        06:00
                                             08:09
# Import the required library
library(caret)
# Create a linear regression model object
lm_model <- lm(ytrain ~ ., data = xtrain)</pre>
# Print the model summary
summary(lm_model)
##
## Call:
## lm(formula = ytrain ~ ., data = xtrain)
##
## Residuals:
## ALL 2 residuals are 0: no residual degrees of freedom!
## Coefficients: (14 not defined because of singularities)
                                Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                  -6.833
                                                 NaN
                                                          NaN
```

```
## DEP DELAY
                                    5.833
                                                  NaN
                                                          NaN
                                                                    NaN
## DEP TIME
                                                   NA
                                                           NA
                                       NA
                                                                     NA
## TAXI OUT
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## TAXI IN
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## ARR_TIME
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## AIR_TIME
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## DISTANCE
                                                   NA
                                                           NA
                                       NA
                                                                     NA
## CARRIER_DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## WEATHER DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## NAS DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## SECURITY_DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## LATE_AIRCRAFT_DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## ARR_DELAY
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## ProperDepartureTimes614:04
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## ProperArrivalTimes617:09
                                       NA
                                                   NA
                                                           NA
                                                                     NA
## Residual standard error: NaN on 0 degrees of freedom
## Multiple R-squared:
                              1,
                                  Adjusted R-squared: 1
                   1.4901e+05 on 1 and 0 DF, p-value: 2.2e16
## F-statistic:
intercept <- coef(lm_model)[1]</pre>
coefficients <- coef(lm_model)</pre>
# Print the intercept term
cat("Intercept:", intercept, "\n")
## Intercept: -6.833333
print(coefficients)
##
                                                   DEP DELAY
                   (Intercept)
                      -6.833333
##
                                                    5.833333
##
                      DEP_TIME
                                                    TAXI OUT
##
                             NA
                                                          NA
##
                                                    ARR_TIME
                       TAXI IN
##
                             NA
                                                          NA
##
                      AIR_TIME
                                                    DISTANCE
##
                                                          NA
                             NA
##
                 CARRIER DELAY
                                              WEATHER_DELAY
##
                             NA
                                                          NA
##
                     NAS DELAY
                                             SECURITY_DELAY
##
                             NA
                                                          NA
##
           LATE_AIRCRAFT_DELAY
                                                   ARR_DELAY
##
                                                          NA
## ProperDepartureTimes614:04
                                  ProperArrivalTimes617:09
##
                             NA
xtrain$ProperDepartureTimes6 <- as.character(xtrain$ProperDepartureTimes6)</pre>
xtest$ProperDepartureTimes6 <- factor(xtest$ProperDepartureTimes6, levels = 1</pre>
evels(xtrain$ProperDepartureTimes6))
xtrain$ProperArrivalTimes6 <- as.character(xtrain$ProperArrivalTimes6)</pre>
```

```
xtest$ProperArrivalTimes6 <- factor(xtest$ProperArrivalTimes6, levels = level</pre>
s(xtrain$ProperArrivalTimes6))
b <- predict(lm_model, newdata = xtest)</pre>
## Warning in predict.lm(lm model, newdata = xtest): prediction from a
## rank-deficient fit may be misleading
head(b, 10)
##
            3
                        4
                                   5
                                               6
                                                          7
                                                                      8
9
## -36.000000 -41.833333 -94.333333 -47.666667 -36.000000 -30.166667 -53.5000
##
           10
                       11
                                  12
## -6.833333 -36.000000 -24.333333
missing_values <- is.na(ytest) | is.na(b)</pre>
## Warning in is.na(ytest) | is.na(b): longer object length is not a multiple
of
## shorter object length
ytest <- as.numeric(ytest[!missing_values])</pre>
## Warning: NAs introduced by coercion
b <- as.numeric(b[!missing_values])</pre>
rss <- sum((ytest - b)^2) # Residual sum of squares
tss <- sum((ytest - mean(ytest))^2) # Total sum of squares
r_squared <-1-(100-(rss / tss))/100
# Print the R-squared value
print(r_squared)
## [1] 0.2173564
# Calculate MSE
mse <- mean((ytest - b)^2)</pre>
# Calculate RMSE
rmse <- sqrt(mse)</pre>
# Print the RMSE value
print(rmse)
## [1] 246.0989
FixedAirlineData$ProperDepartureTimes6 <- as.character(FixedAirlineData$Prope
rDepartureTimes6)
FixedAirlineData$ProperDepartureTimes6 <- factor(FixedAirlineData$ProperDepar
tureTimes6, levels = levels(FixedAirlineData$ProperDepartureTimes6))
FixedAirlineData$ProperArrivalTimes6 <- as.character(FixedAirlineData$ProperA
```

```
rrivalTimes6)
FixedAirlineData$ProperArrivalTimes6 <- factor(FixedAirlineData$ProperArrival
Times6, levels = levels(FixedAirlineData$ProperArrivalTimes6))
FixedAirlineData$ARR_DELAY <- as.numeric(as.character(FixedAirlineData$ARR_DE
LAY))
a = predict(lm_model, newdata=FixedAirlineData)
## Warning in predict.lm(lm model, newdata = FixedAirlineData): prediction fr
om a
## rank-deficient fit may be misleading
head(a, 10)
##
            1
                       2
                                   3
                                                         5
                                                                     6
                                              4
7
##
    -1.000000 -36.000000 -36.000000 -41.833333 -94.333333 -47.666667 -36.0000
00
##
                                  10
## -30.166667 -53.500000 -6.833333
mlr_Airline=FixedAirlineData
mlr_Airline['MLR_Prediction']=a
head(mlr_Airline['MLR_Prediction'],10)
      MLR Prediction
##
## 1
           -1.000000
## 2
          -36.000000
## 3
          -36.000000
## 4
          -41.833333
## 5
          -94.333333
## 6
          -47.666667
## 7
          -36.000000
## 8
          -30.166667
## 9
          -53.500000
## 10
          -6.833333
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
Airline_Results <- mlr_Airline %>%
  filter(MLR Prediction == a) %>%
  select(OP_UNIQUE_CARRIER, ORIGIN, DEST, MLR_Prediction) %>%
```

```
arrange(OP_UNIQUE_CARRIER)
head(Airline_Results, 10)
##
      OP_UNIQUE_CARRIER ORIGIN DEST MLR_Prediction
## 1
                     9E
                            GNV ATL
                                          -1.000000
## 2
                     9E
                            MSP CVG
                                         -36.000000
                            DTW CVG
## 3
                     9E
                                         -36.000000
## 4
                     9E
                            TLH ATL
                                         -41.833333
## 5
                     9E
                            ATL FSM
                                         -94.333333
## 6
                     9E
                            DAY MSP
                                         -47.666667
                     9E
                            JAN ATL
                                         -36.000000
## 7
                     9E
                            LGA CVG
## 8
                                         -30.166667
## 9
                     9E
                            JAX LGA
                                         -53.500000
## 10
                     9E
                            ATL
                                BMI
                                          -6.833333
positive_valuesMLR <- Airline_Results$MLR_Prediction[Airline_Results$MLR_Pred</pre>
iction >= 0]
negative_valuesMLR <- Airline_Results$MLR_Prediction[Airline_Results$MLR_Pred</pre>
iction < ∅]
length(positive_valuesMLR)
## [1] 320233
length(negative_valuesMLR)
## [1] 676152
percentnegatvieMLR<-length(negative_valuesMLR)/(length(negative_valuesMLR)+le</pre>
ngth(positive_valuesMLR))
print(percentnegatvieMLR)
## [1] 0.6786052
print(1-percentnegatvieMLR)
## [1] 0.3213948
```