## R code

```
#libraries
library(mice)
library(knitr)
library(VIM)
library(readr)
library(readr)
library(leaps)
library(MASS)
#importing data and setting working direct.
setwd("~/Desktop/NW MSDS/MSDS411/Unit 1/Moneyball/")
moneyball=read.csv("moneyball.csv",header=T)
#Exploratory Data Analysis
str(moneyball)
head(moneyball)
summary(moneyball)
correlations <- cor(moneyball)
round(correlations,2)
par(mfrow=c(1,2))
hist(moneyball$TARGET WINS, col = "#A71930", xlab = "TARGET WINS", main = "Histogram of
Wins")
boxplot(moneyball$TARGET WINS, col = "#A71930", main = "Boxplot of Wins")
par(mfrow = c(1,1))
##
#Batting
par(mfrow=c(2,2))
hist(moneyball$TEAM BATTING H, col = "#A71930", xlab = "Team Batting H", main =
"Histogram of Hits")
hist(moneyball$TEAM BATTING 2B, col = "#09ADAD", xlab = "Doubles", main = "Histogram of
Doubles")
boxplot(moneyball$TEAM BATTING H, col = "#A71930", main = "Boxplot of Hits")
boxplot(moneyball$TEAM BATTING 2B, col = "#09ADAD", main = "Boxplot of Doubles")
par(mfrow=c(1,1))
##
par(mfrow=c(2,2))
hist(moneyball$TEAM BATTING 3B, col = "#A71930", xlab = "Triples", main = "Histogram of
Triples")
hist(moneyball$TEAM BATTING HR, col = "#DBCEAC", xlab = "Home Runs", main = "Histogram
of Home Runs")
boxplot(moneyball$TEAM BATTING 3B, col = "#A71930", main = "Boxplot of Triples")
boxplot(moneyball$TEAM_BATTING_HR, col = "#DBCEAC", main = "Boxplot of Home Runs")
par(mfrow=c(1,1))
##
```

```
par(mfrow=c(2,3))
hist(moneyball$TEAM BATTING BB, col = "#A71930", xlab = "Walks", main = "Histogram of
Walks")
hist(moneyball$TEAM BATTING SO, col = "#09ADAD", xlab = "Strikeouts", main = "Histogram
of Strikeouts")
hist(moneyball$TEAM BATTING HBP, col = "#DBCEAC", xlab = "Hit By Pitches", main =
"Histogram of HBP")
boxplot(moneyball$TEAM BATTING BB, col = "#A71930", main = "Boxplot of Walks")
boxplot(moneyball$TEAM BATTING SO, col = "#09ADAD", main = "Boxplot of Strikeouts")
boxplot(moneyball$TEAM BATTING HBP, col = "#DBCEAC", main = "Boxplot of HBP")
par(mfrow=c(1,1))
##
par(mfrow=c(2,2))
hist(moneyball$TEAM BASERUN SB, col = "#A71930", xlab = "Stolen Bases", main = "Histogram
of Steals")
hist(moneyball$TEAM BASERUN CS, col = "#DBCEAC", xlab = "Caught Stealing", main =
"Histogram of CS")
boxplot(moneyball$TEAM BASERUN SB, col = "#A71930", main = "Boxplot of Steals")
boxplot(moneyball$TEAM BASERUN CS, col = "#DBCEAC", main = "Boxplot of CS")
par(mfrow=c(1,1))
##
#pitching
par(mfrow=c(2,2))
hist(moneyball$TEAM PITCHING H, col = "#A71930", xlab = "Hits Against", main = "Histogram"
of Hits Against")
hist(moneyball$TEAM PITCHING HR, col = "#09ADAD", xlab = "Home Runs Against", main =
"Histograms of HR Against")
boxplot(moneyball$TEAM PITCHING H, col = "#A71930", main = "Boxplot of Hits Against")
boxplot(moneyball$TEAM PITCHING HR, col = "#09ADAD", main = "Boxplot of HR Against")
par(mfrow=c(1,1))
##
par(mfrow=c(2,2))
hist(moneyball$TEAM PITCHING BB, col = "#A71930", xlab = "Walks Allowed", main =
"Histogram of Walks Allowed")
hist(moneyball$TEAM PITCHING SO, col = "#DBCEAC", xlab = "Strikeouts", main = "Histograms
of Strikeouts")
boxplot(moneyball$TEAM PITCHING BB, col = "#A71930", main = "Boxplot of Walks Allowed")
boxplot(moneyball$TEAM_PITCHING SO, col = "#DBCEAC", main = "Boxplot of Strikeouts")
par(mfrow=c(1,1))
##
#fielding
par(mfrow=c(2,2))
hist(moneyball$TEAM FIELDING DP, col = "#A71930", xlab = "Double Plays", main =
"Histogram of Double Plays")
```

```
hist(moneyball$TEAM FIELDING E, col = "#09ADAD", xlab = "Errors Committed", main =
"Histogram of Errors Committed")
boxplot(moneyball$TEAM FIELDING DP, col = "#A71930", main = "Boxplot of Double Plays")
boxplot(moneyball$TEAM FIELDING E, col = "#09ADAD", main = "Boxplot of Errors
Committed")
par(mfrow=c(1,1))
##
#scatter matrix
panel.cor <- function(x, y, digits=2, prefix="", cex.cor, ...)
 usr <- par("usr"); on.exit(par(usr))</pre>
 par(usr = c(0, 1, 0, 1))
 r \leftarrow abs(cor(x, y))
 txt <- format(c(r, 0.123456789), digits=digits)[1]
 txt <- paste(prefix, txt, sep="")
if(missing(cex.cor)) cex.cor <- 0.8/strwidth(txt)
text(0.5, 0.5, txt, cex = cex.cor * r)
}
# Batting Stats and Wins
pairs(moneyball[2:8], lower.panel=panel.smooth, upper.panel = panel.cor)
#Baserunning Stats and Wins
pairs(~ moneyball$TARGET WINS + moneyball$TEAM BASERUN CS +
moneyball$TEAM BASERUN SB, lower.panel = panel.smooth)
#Pitcher Stats and Wins
pairs(~ moneyball$TARGET WINS + moneyball$TEAM PITCHING BB +
moneyball$TEAM PITCHING H+
    moneyball$TEAM PITCHING HR + moneyball$TEAM PITCHING SO, lower.panel =
panel.smooth)
#mice package
head(moneyball)
summary(moneyball)
md.pattern(moneyball)
m <- md.pairs(moneyball);m
pbox(moneyball,pos=1,int=FALSE,cex=0.7)
imp <- mice(moneyball)</pre>
imp
head(complete(imp))
moneyballfilled <- complete(imp)
#capOutlier <- function(x){
```

```
\#qnt \leftarrow quantile(x, probs=c(.25, .75), na.rm = T)
  \#caps <- quantile(x, probs=c(.01, .99), na.rm = T)
  \#H < -1.5 * IQR(x, na.rm = T)
  ||x|| + ||x|
 \#x[x > (qnt[2] + H)] < -caps[2]
 #return(x)
#}
#moneyballfilled$TARGET WINS=capOutlier(moneyballfilled$TARGET_WINS)
#moneyballfilled$TEAM BATTING H=capOutlier(moneyballfilled$TEAM BATTING H)
#moneyballfilled$TEAM BATTING 2B=capOutlier(moneyballfilled$TEAM BATTING 2B)
#moneyballfilled$TEAM BATTING 3B=capOutlier(moneyballfilled$TEAM BATTING 3B)
#moneyballfilled$TEAM BATTING HR=capOutlier(moneyballfilled$TEAM BATTING HR)
#moneyballfilled$TEAM BATTING BB=capOutlier(moneyballfilled$TEAM BATTING BB)
#moneyballfilled$TEAM BATTING SO=capOutlier(moneyballfilled$TEAM BATTING SO)
#moneyballfilled$TEAM BASERUN SB=capOutlier(moneyballfilled$TEAM BASERUN SB)
#moneyballfilled$TEAM BATTING HBP=capOutlier(moneyballfilled$TEAM BATTING HBP)
#moneyballfilled$TEAM PITCHING H=capOutlier(moneyballfilled$TEAM PITCHING H)
#moneyballfilled$TEAM PITCHING HR=capOutlier(moneyballfilled$TEAM PITCHING HR)
#moneyballfilled$TEAM PITCHING BB=capOutlier(moneyballfilled$TEAM PITCHING BB)
#moneyballfilled$TEAM PITCHING SO=capOutlier(moneyballfilled$TEAM PITCHING SO)
write.csv(moneyballfilled, file = "moneyballcleanedtrain.csv")
summary(moneyballfilled)
## model creation
mse <- function(sm)
 mean(sm$residuals^2)
# model 1
model1 <- Im(TARGET WINS ~ TEAM BATTING H + TEAM BATTING BB + TEAM BASERUN SB
+ TEAM PITCHING HR +
                     TEAM PITCHING BB + TEAM PITCHING SO + TEAM PITCHING H +
TEAM PITCHING BB, data = moneyballfilled)
summary(model1)
vif(model1)
# model 2 (stepwise approach)
stepwisemodel <- Im(formula = TARGET WINS ~ TEAM BATTING 2B + TEAM BATTING 3B +
TEAM BATTING HR+
                     TEAM BATTING H+
                      TEAM BATTING BB + TEAM BATTING SO + TEAM BASERUN SB +
TEAM BASERUN CS + TEAM PITCHING HR +
                     TEAM PITCHING BB + TEAM PITCHING SO + TEAM FIELDING E +
TEAM FIELDING DP, data = moneyballfilled)
model2 <- stepAIC(stepwisemodel, direction = "both")
summary(model2)
```

```
vif(model2)
# model 3 (subset models)
subsets <- regsubsets(TARGET WINS ~ TEAM BATTING 2B + TEAM BATTING 3B +
TEAM BATTING HR+
           TEAM BATTING H+
           TEAM BATTING BB + TEAM BATTING SO + TEAM BASERUN SB +
TEAM BASERUN CS + TEAM PITCHING HR +
           TEAM PITCHING BB + TEAM PITCHING SO + TEAM FIELDING E +
TEAM FIELDING DP, data = moneyballfilled, nvmax = 12, nbest = 1)
subsets
summary(subsets)
plot(subsets, scale="adjr2")
subset1 <- Im(TARGET WINS ~
       TEAM BATTING H, data = moneyballfilled)
summary(subset1)
subset2 <- Im(TARGET WINS ~
       TEAM_BATTING_H + TEAM_FIELDING_E, data = moneyballfilled)
summary(subset2)
subset3 <- Im(TARGET WINS ~
       TEAM BATTING H + TEAM FIELDING E + TEAM BASERUN SB, data = moneyballfilled)
summary(subset3)
subset4 <- Im(TARGET WINS ~
       TEAM BATTING H + TEAM FIELDING E + TEAM BASERUN SB + TEAM FIELDING DP,
data = moneyballfilled)
summary(subset4)
subset5 <- Im(TARGET WINS ~
       TEAM BATTING H+TEAM BATTING HR+TEAM BATTING SO+TEAM FIELDING E+
TEAM BASERUN SB, data = moneyballfilled)
summary(subset5)
subset6 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E + TEAM BATTING SO
+ TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H,
       data = moneyballfilled)
summary(subset6)
subset7 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E + TEAM BATTING SO
+ TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H + TEAM PITCHING BB,
```

```
data = moneyballfilled)
summary(subset7)
subset8 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E + TEAM BATTING SO
+ TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H + TEAM PITCHING BB +
       TEAM BATTING 2B, data = moneyballfilled)
summary(subset8)
subset9 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E + TEAM BATTING SO
+ TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H + TEAM PITCHING BB +
       TEAM BATTING 3B + TEAM BASERUN CS, data = moneyballfilled)
summary(subset9)
subset10 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E +
TEAM BATTING SO + TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H +
TEAM PITCHING BB+
       TEAM BATTING 3B + TEAM BATTING 2B + TEAM BASERUN CS, data =
moneyballfilled)
summary(subset10)
subset11 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E +
TEAM BATTING SO + TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H +
TEAM PITCHING BB+
        TEAM BATTING 3B + TEAM BATTING 2B + TEAM BASERUN CS +
TEAM PITCHING SO, data = moneyballfilled)
summary(subset11)
vif(subset11)
subset12 <- Im(TARGET WINS ~ TEAM FIELDING DP + TEAM FIELDING E +
TEAM BATTING SO + TEAM BASERUN SB + TEAM BATTING HR + TEAM BATTING H +
TEAM PITCHING BB+
        TEAM BATTING 3B + TEAM BATTING 2B + TEAM BASERUN CS +
TEAM PITCHING SO + TEAM BATTING BB, data = moneyballfilled)
summary(subset12)
vif(subset12)
#########
#metrics
AIC(model1)
AIC(model2)
AIC(subset1)
AIC(subset2)
AIC(subset3)
AIC(subset4)
```

```
AIC(subset5)
AIC(subset6)
AIC(subset7)
AIC(subset8)
AIC(subset9)
AIC(subset10)
AIC(subset11)
AIC(subset12)
mse(model1)
mse(model2)
mse(subset1)
mse(subset2)
mse(subset3)
mse(subset4)
mse(subset5)
mse(subset6)
mse(subset7)
mse(subset8)
mse(subset9)
mse(subset10)
mse(subset11)
mse(subset12)
####
#fixing Test DATA
moneyball test=read.csv("moneyball test.csv",header=T)
md.pattern(moneyball test)
m2 <- md.pairs(moneyball test);m
pbox(moneyball test,pos=1,int=FALSE,cex=0.7)
imp2 <- mice(moneyball test)</pre>
imp2
head(complete(imp2))
moneyball test filled <- complete(imp2)
pbox(moneyball_test_filled,int=FALSE,cex=0.7)
summary(moneyball test filled)
#Scoring
moneyball test filled$P TARGET WINS <-
30.9909146
- 0.0980972 * moneyball test filled$TEAM FIELDING DP
- 0.0351613 * moneyball test filled$TEAM FIELDING E
- 0.0163923 * moneyball test filled$TEAM BATTING SO
+ 0.0457459 * moneyball test filled$TEAM BASERUN SB +
+ 0.0861166 * moneyball test filled$TEAM BATTING HR +
+ 0.0447497 * moneyball test filled$TEAM BATTING H+
+ 0.0017051 * moneyball test filled$TEAM PITCHING BB +
```

- + 0.0266074 \* moneyball\_test\_filled\$TEAM\_BATTING\_3B -
- 0.0176317 \* moneyball\_test\_filled\$TEAM\_BATTING\_2B -
- 0.0107410 \* moneyball\_test\_filled\$TEAM\_BASERUN\_CS +
- + 0.0029857 \* moneyball\_test\_filled\$TEAM\_PITCHING\_SO +
- + 0.0049060 \* moneyball\_test\_filled\$TEAM\_BATTING\_BB

#subset for file submission
prediction <- moneyball\_test\_filled[c("INDEX","P\_TARGET\_WINS")]
prediction\$P\_TARGET\_WINS[(prediction\$P\_TARGET\_WINS < 40)] = 40
prediction\$P\_TARGET\_WINS[(prediction\$P\_TARGET\_WINS > 115)] = 115
## writen csv for submission
write.csv(prediction, file = "logan\_strouse\_predictions.csv")