

Project Code (Analysis and Interpretation Included in Presentation)

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```
# Function that merges gamelogs and performance splits
# Calls Helper Function for Each of 9 lineup positions and both teams
mergeLogsSplitsBref <- function(logs,splits) {
  logs <- mergeLogSplitsBrefPosition(logs,splits,1,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,2,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,3,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,4,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,5,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,6,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,7,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,8,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,9,"visitor")
  logs <- mergeLogSplitsBrefPosition(logs,splits,1,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,2,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,3,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,4,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,5,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,6,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,7,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,8,"home")
  logs <- mergeLogSplitsBrefPosition(logs,splits,9,"home")
}

# Merges the datasets after handling exceptions explicitly
mergeLogSplitsBrefPosition <- function(logs,splits,num,team) {
  colnames(splits) <- paste0(team,num,colnames(splits))
  logs[,paste0(team,num,"Name")] <- gsub("\\.", "", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("i-M", "i M", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("n-J", "n J", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Dee Gordon", "Dee Strange-Gordon", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Giovanny Urshela", "Gio Urshela", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Michael Taylor", "Michael A. Taylor", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Vincent Velasquez", "Vince Velasquez", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Michael Brosseau", "Mike Brosseau", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Nate Lowe", "Nathanial Lowe", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Phillip Ervin", "Phil Ervin", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Josh Fuentes", "Joshua Fuentes", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Yulieski Gurriel", "Yuli Gurriel", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Steve Wilkerson", "Stevie Wilkerson", logs[,paste0(team,num,"Name")])
}
```

```
logs[,paste0(team,num,"Name")] <- gsub("Mike Soroka","Michael Soroka",logs[,paste0(team,num,"Name")])
return(merge(x=logs,y=splits,by.x=paste0(team,num,"Name"),by.y=paste0(team,num,"Name")))
}
```

Background

All the data used is pulled from either baseball reference using the baseballr R package, or from Retrosheet game logs. All the data in both databases is complete for the years (2012 to 2019) that we are considering in our analysis. The objective of our analysis is to determine whether there exists a predictive relationship between previous hitting statistics and order in the lineup for hitters/lineups in the MLB.

Cleaning the Data

Define helper functions to clean data (included in EDA)

```
library(baseballr); library(janitor); library(RcppParallel); library(lubridate);library(dplyr);library(stringr);
```

```
## Warning: package 'baseballr' was built under R version 4.3.3
```

```
## Warning: package 'janitor' was built under R version 4.3.3
```

```
## Warning: package 'RcppParallel' was built under R version 4.3.3
```

```
## Warning: package 'lubridate' was built under R version 4.3.3
```

```
## Warning: package 'dplyr' was built under R version 4.3.3
```

```
## Warning: package 'stringr' was built under R version 4.3.3
```

```
# Renames and Drops Columns in Gamelogs
cleanLogs <- function(logs) {
  outlogs <- logs[-c(2:3,12:89,94:105,160:161)]
  colnames(outlogs) <- c("Date","VisitingTeam","VisitingTeamLeague","VisitingGameNum","HomeTeam",
    "HomeTeamLeague","HomeGameNum","VisitingScore","HomeScore","visitingManagerID",
    "visitingManagerName","homeManagerID","homeManagerName",
    "visitor1ID","visitor1Name","visitor1Position",
    "visitor2ID","visitor2Name","visitor2Position",
    "visitor3ID","visitor3Name","visitor3Position",
    "visitor4ID","visitor4Name","visitor4Position",
    "visitor5ID","visitor5Name","visitor5Position",
    "visitor6ID","visitor6Name","visitor6Position",
    "visitor7ID","visitor7Name","visitor7Position",
    "visitor8ID","visitor8Name","visitor8Position",
    "visitor9ID","visitor9Name","visitor9Position",
    "home1ID","home1Name","home1Position",
    "home2ID","home2Name","home2Position",
    "home3ID","home3Name","home3Position",
    "home4ID","home4Name","home4Position",
    "home5ID","home5Name","home5Position",
```

```

        "home6ID", "home6Name", "home6Position",
        "home7ID", "home7Name", "home7Position",
        "home8ID", "home8Name", "home8Position",
        "home9ID", "home9Name", "home9Position")

    return(outlogs)
}

# Prepares the data for merging based on the previous year
yearSplits <- function(year) {
  splits <- data.frame(bref_daily_batter(paste(year, "01", "01", sep="-"), paste(year, "12", "31", sep="-")))
  splits <- splits[-c(1:2, 4, 5)]
  splits$Name <- iconv(splits$Name, from="UTF-8", to="ASCII//TRANSLIT")
  splits$Name <- str_replace_all(splits$Name, " Jr\\.", "")
  return(splits)
}

# Merges Performance Splits overall all players in each lineup position
mergeAll <- function(logs, splits) {
  out <- mergePosition(logs, splits, "visitor", 1)
  out <- rbind(out, mergePosition(logs, splits, "visitor", 2))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 3))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 4))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 5))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 6))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 7))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 8))
  out <- rbind(out, mergePosition(logs, splits, "visitor", 9))
  out <- rbind(out, mergePosition(logs, splits, "home", 1))
  out <- rbind(out, mergePosition(logs, splits, "home", 2))
  out <- rbind(out, mergePosition(logs, splits, "home", 3))
  out <- rbind(out, mergePosition(logs, splits, "home", 4))
  out <- rbind(out, mergePosition(logs, splits, "home", 5))
  out <- rbind(out, mergePosition(logs, splits, "home", 6))
  out <- rbind(out, mergePosition(logs, splits, "home", 7))
  out <- rbind(out, mergePosition(logs, splits, "home", 8))
  out <- rbind(out, mergePosition(logs, splits, "home", 9))
}

# Handles
mergePosition <- function(logs, splits, team, num){
  logs[,paste0(team,num,"Name")] <- gsub("\\.", "", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("i-M", "i M", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("n-J", "n J", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Dee Gordon", "Dee Strange-Gordon", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Giovanny Urshela", "Gio Urshela", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Michael Taylor", "Michael A. Taylor", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Vincent Velasquez", "Vince Velasquez", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Michael Brosseau", "Mike Brosseau", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Nate Lowe", "Nathanial Lowe", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Phillip Ervin", "Phil Ervin", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Josh Fuentes", "Joshua Fuentes", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Yulieski Gurriel", "Yuli Gurriel", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Steve Wilkerson", "Stevie Wilkerson", logs[,paste0(team,num,"Name")])
  logs[,paste0(team,num,"Name")] <- gsub("Mike Soroka", "Michael Soroka", logs[,paste0(team,num,"Name")])
  out <- merge(splits, logs, by.x="Name", by.y=paste0(team,num,"Name"))
}

```

```

  out <- mutate(out[,c(1:35,37,39)],homeAway=team,lineupPosition=as.numeric(num))
}

```

Import/Merge Data (included in EDA)

```

gl2012 <- cleanLogs(read.csv("gl2012.txt", header=FALSE))
gl2013 <- cleanLogs(read.csv("gl2013.txt", header=FALSE))
gl2014 <- cleanLogs(read.csv("gl2014.txt", header=FALSE))
gl2015 <- cleanLogs(read.csv("gl2015.txt", header=FALSE))
gl2016 <- cleanLogs(read.csv("gl2016.txt", header=FALSE))
gl2017 <- cleanLogs(read.csv("gl2017.txt", header=FALSE))
gl2018 <- cleanLogs(read.csv("gl2018.txt", header=FALSE))
gl2019 <- cleanLogs(read.csv("gl2019.txt", header=FALSE))
#split2012 <- yearSplits(2012)
#write.csv(split2012,"splits2012.csv")
split2012 <- read.csv("splits2012.csv")
#split2013 <- yearSplits(2013)
#write.csv(split2013,"splits2013.csv")
split2013 <- read.csv("splits2013.csv")
#split2014 <- yearSplits(2014)
#write.csv(split2014,"splits2014.csv")
split2014 <- read.csv("splits2014.csv")
#split2015 <- yearSplits(2015)
#write.csv(split2015,"splits2015.csv")
split2015 <- read.csv("splits2015.csv")
#split2016 <- yearSplits(2016)
#write.csv(split2016,"splits2016.csv")
split2016 <- read.csv("splits2016.csv")
#split2017 <- yearSplits(2017)
#write.csv(split2017,"splits2017.csv")
split2017 <- read.csv("splits2017.csv")
#split2018 <- yearSplits(2018)
#write.csv(split2018,"splits2018.csv")
split2018 <- read.csv("splits2018.csv")
#split2019 <- yearSplits(2019)
#write.csv(split2019,"splits2019.csv")
split2019 <- read.csv("splits2019.csv")

master <- mergeAll(gl2012,split2012)
master <- rbind(master,mergeAll(gl2013,split2013))
master <- rbind(master,mergeAll(gl2014,split2014))
master <- rbind(master,mergeAll(gl2015,split2015))
master <- rbind(master,mergeAll(gl2016,split2016))
master <- rbind(master,mergeAll(gl2017,split2017))
master <- rbind(master,mergeAll(gl2018,split2018))
master <- rbind(master,mergeAll(gl2019,split2019))

matched <- mergeLogsSplitsBref(gl2012,split2012)
matched <- rbind(matched,mergeLogsSplitsBref(gl2013,split2013))
matched <- rbind(matched,mergeLogsSplitsBref(gl2014,split2014))
matched <- rbind(matched,mergeLogsSplitsBref(gl2015,split2015))
matched <- rbind(matched,mergeLogsSplitsBref(gl2016,split2016))
matched <- rbind(matched,mergeLogsSplitsBref(gl2017,split2017))

```

```
matched <- rbind(matched,mergeLogsSplitsBref(gl2018,split2018))
matched <- rbind(matched,mergeLogsSplitsBref(gl2019,split2019))
# Prepared Dataset for Matched Paris Analysis was Never Used
```

This section is used to trim the non-qualified hitters from the dataset and was previously used to investigate transformation and standardization of data with year by year rate and summary statistics for the entire league. Unfortunately these did not improve the normality of the dataset so we decided not to use them.

```
#yearByYearAverages <- read.csv("yearByYearAverages.csv")
#yearByYearTotals <- read.csv("yearByYearTotals.csv")
dataset2 <- master[(master$PA/(162)) > 3,]
#dataset3 <- dataset2[dataset2$BA < median(dataset2$BA)+3*sd(ma),]
write.csv(dataset2,"compiledDataset.csv")
```

This chunk can be used to loaded the full dataset instead of compiling it separately from the component files.

```
dataset2 <- read.csv("compiledDataset.csv")
```

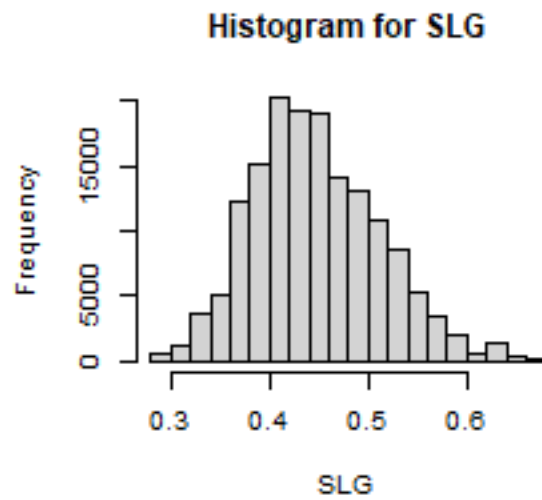
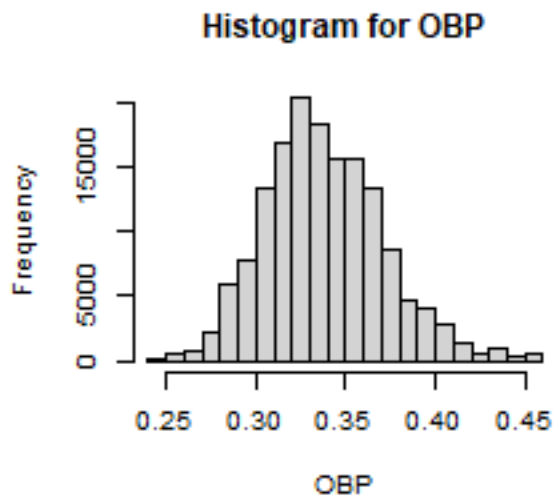
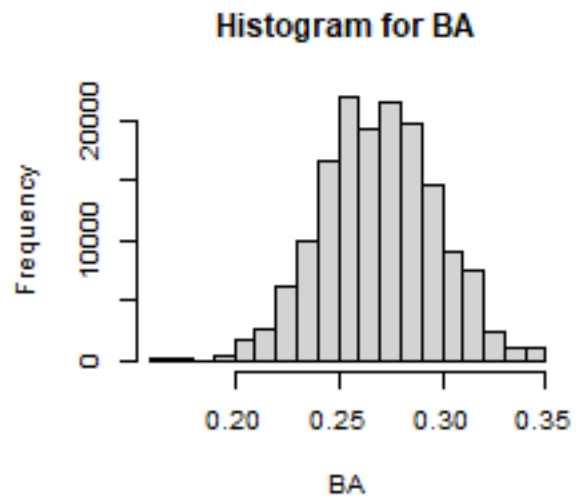
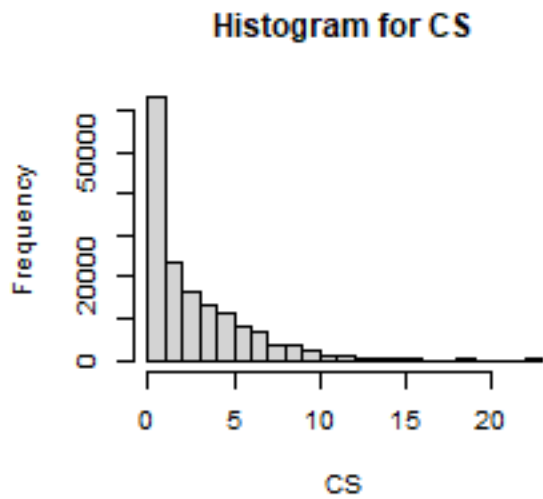
Correlation Data (included in EDA)

```
cor <- cor(dataset2[,c(24:27)],use="complete.obs")
cor
```

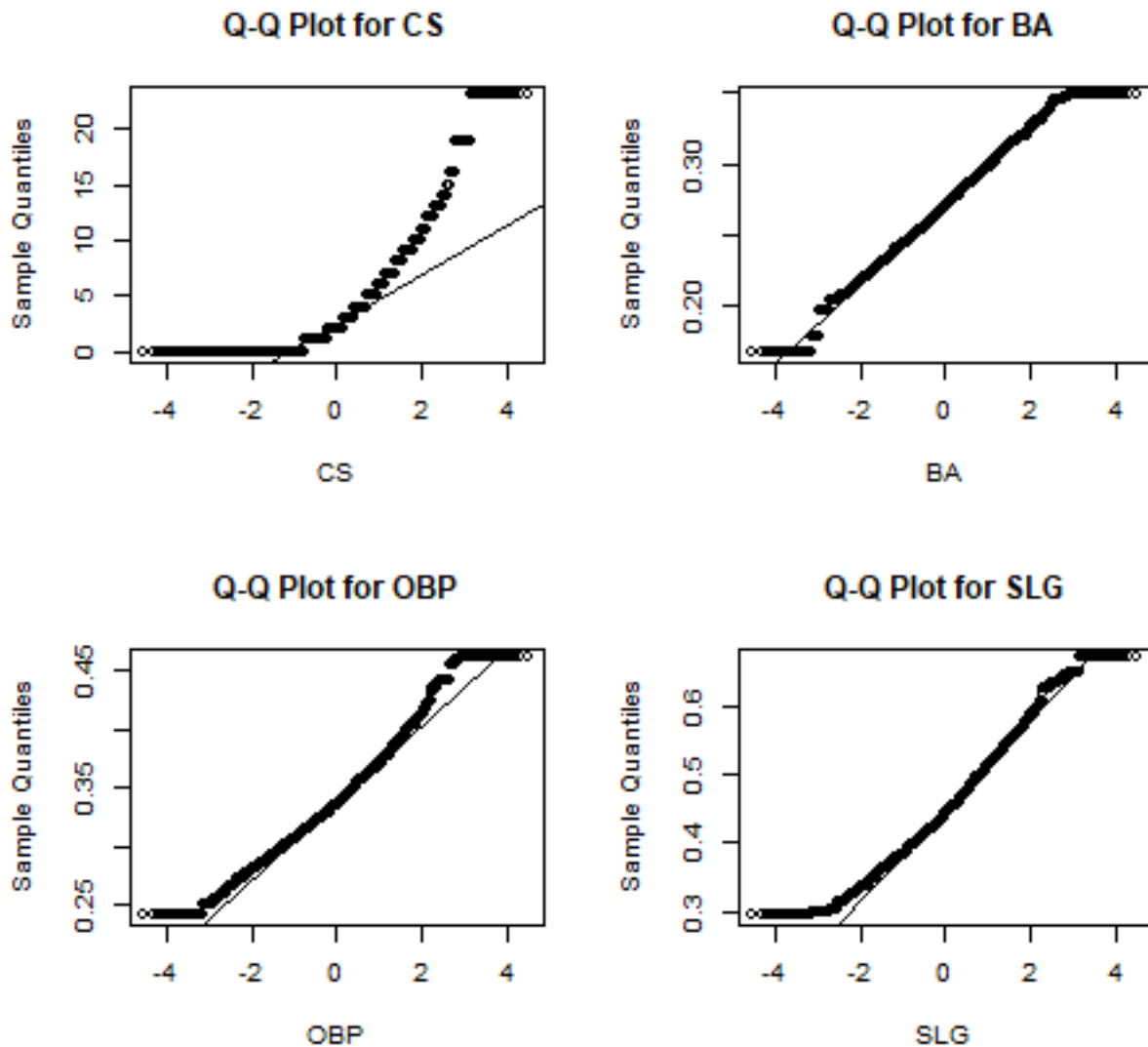
```
##           CS           BA           OBP           SLG
## CS    1.0000000000  0.1405801  0.0005778809 -0.1497093
## BA    0.1405801024  1.0000000  0.6963426679  0.5080134
## OBP   0.0005778809  0.6963427  1.0000000000  0.6382821
## SLG  -0.1497092574  0.5080134  0.6382821268  1.0000000
```

Investigate Normality of Explanatory Variables with Histograms and Q-Q Plots

```
par(mfrow=c(2,2))
imain=c(24:27)
for(i in imain){
  hist(dataset2[,i],main=paste0("Histogram for ",names(dataset2[i])),xlab=names(dataset2[i]))
}
```



```
for(i in imain){
  qqnorm(dataset2[,i],main=paste0("Q-Q Plot for ",names(dataset2[i])),xlab=names(dataset2[i]))
  qqline(dataset2[,i])
}
```



```
par(mfrow=c(1,1))
```

One Way ANOVA Between Each Explanatory Variable and Lineup Position

```
par(mfrow=c(2,2))
for(i in imain) {
  print(paste0("ANOVA for ",names(dataset2[i])))
  print(summary(aov(dataset2[,i] ~ factor(lineupPosition),data=dataset2)))
}
```

```
## [1] "ANOVA for CS"
##               Df Sum Sq Mean Sq F value Pr(>F)
## factor(lineupPosition)      8  255415    31927    4224 <2e-16 ***
## Residuals              155271  1173630         8
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
## [1] "ANOVA for BA"
##               Df Sum Sq Mean Sq F value Pr(>F)
## factor(lineupPosition)      8  12.54   1.5679    2346 <2e-16 ***
## Residuals              155271 103.79   0.0007
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## [1] "ANOVA for OBP"
##               Df Sum Sq Mean Sq F value Pr(>F)
## factor(lineupPosition)      8  29.29   3.661    3987 <2e-16 ***
## Residuals              155271 142.59   0.001
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## [1] "ANOVA for SLG"
##               Df Sum Sq Mean Sq F value Pr(>F)
## factor(lineupPosition)      8 105.7   13.209    3875 <2e-16 ***
## Residuals              155271  529.3   0.003
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

par(mfrow=c(1,1))
```

One Variable Linear Regression Between Each Explanatory Variable and Lineup Position

```
par(mfrow=c(2,2))
for(i in imain) {
  #plot(lm(lineupPosition ~ dataset2[,i],data=dataset2))
  print(paste0("Linear Regression for ",names(dataset2[i])))
  print(summary(lm(lineupPosition ~ dataset2[,i],data=dataset2)))
  print(" ")
}
```

```
## [1] "Linear Regression for CS"
##
## Call:
## lm(formula = lineupPosition ~ dataset2[, i], data = dataset2)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -3.2258 -1.6560 -0.2258  1.2015  7.0533
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   4.225809   0.007259   582.2   <2e-16 ***
## dataset2[, i] -0.142442   0.001710   -83.3   <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.044 on 155278 degrees of freedom
## Multiple R-squared:  0.04278,    Adjusted R-squared:  0.04277
## F-statistic: 6939 on 1 and 155278 DF,  p-value: < 2.2e-16
##
## [1] " "
## [1] "Linear Regression for BA"
```



```

##
## Call:
## lm(formula = lineupPosition ~ dataset2[, i], data = dataset2)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -4.9507 -1.5108 -0.1628  1.3420  6.8354
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    9.48442    0.05055   187.6  <2e-16 ***
## dataset2[, i] -21.03401    0.18620  -113.0  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.008 on 155278 degrees of freedom
## Multiple R-squared:  0.07594,    Adjusted R-squared:  0.07593
## F-statistic: 1.276e+04 on 1 and 155278 DF,  p-value: < 2.2e-16
##
## [1] " "
## [1] "Linear Regression for OBP"
##
## Call:
## lm(formula = lineupPosition ~ dataset2[, i], data = dataset2)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -4.698 -1.559 -0.004  1.352  6.729
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   10.51075    0.05146   204.2  <2e-16 ***
## dataset2[, i] -19.80662    0.15123  -131.0  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.983 on 155278 degrees of freedom
## Multiple R-squared:  0.09948,    Adjusted R-squared:  0.09948
## F-statistic: 1.715e+04 on 1 and 155278 DF,  p-value: < 2.2e-16
##
## [1] " "
## [1] "Linear Regression for SLG"
##
## Call:
## lm(formula = lineupPosition ~ dataset2[, i], data = dataset2)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -3.6496 -1.7251 -0.0734  1.3924  5.6986
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    6.30545    0.03691   170.81  <2e-16 ***
## dataset2[, i]  -5.59422    0.08169  -68.48  <2e-16 ***

```

```
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.058 on 155278 degrees of freedom
## Multiple R-squared:  0.02932,    Adjusted R-squared:  0.02931
## F-statistic: 4690 on 1 and 155278 DF,  p-value: < 2.2e-16
##
## [1] " "
```

```
par(mfrow=c(1,1))
```

Multiple Regression with Interaction Effects (and added confounding effect of number of games that the player played in the previous season)

```
temp <- lm(lineupPosition ~ BA*OBP*SLG*OPS*G,data=dataset2)
summary(temp)
```

```
##
## Call:
## lm(formula = lineupPosition ~ BA * OBP * SLG * OPS * G, data = dataset2)
##
## Residuals:
```

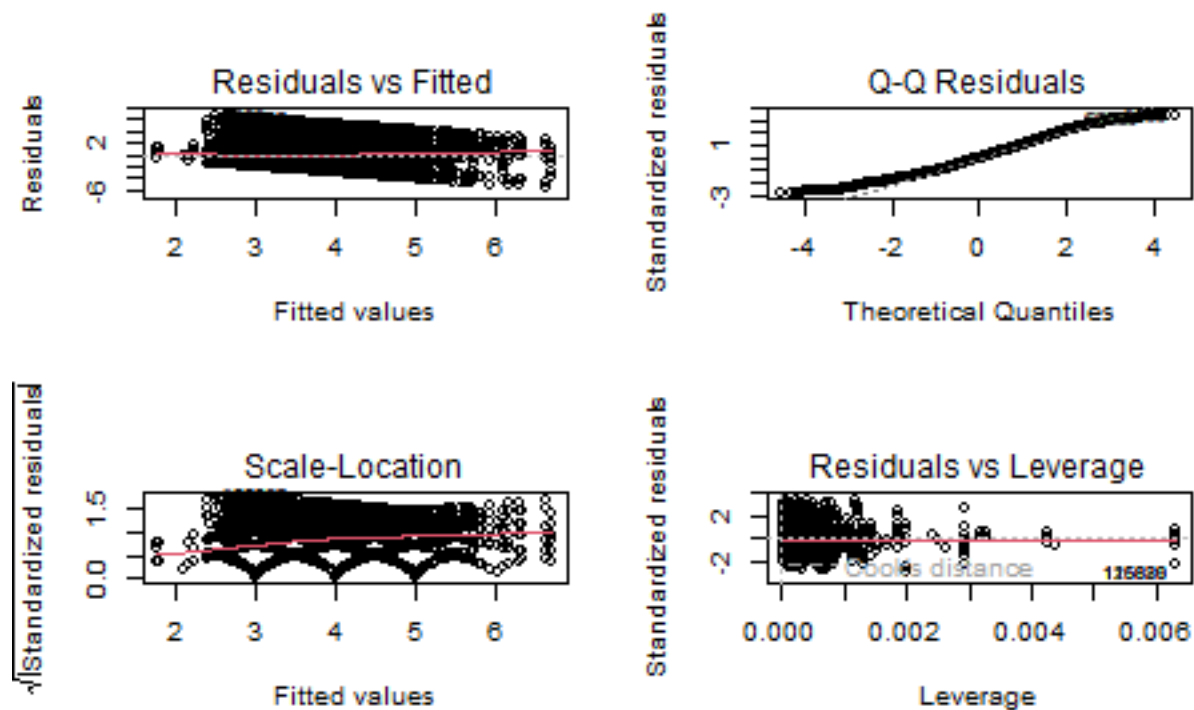
	Min	1Q	Median	3Q	Max
	-5.6299	-1.4657	-0.0519	1.2317	6.5030

```
##
## Coefficients:
```

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	318.584	145.641	2.187	0.02871 *
BA	-257.549	524.365	-0.491	0.62331
OBP	1701.817	1520.509	1.119	0.26304
SLG	2050.876	1532.648	1.338	0.18086
OPS	-3959.666	1475.870	-2.683	0.00730 **
G	-2.645	1.039	-2.547	0.01088 *
BA:OBP	-11148.361	5611.808	-1.987	0.04697 *
BA:SLG	-9108.770	5680.650	-1.603	0.10883
OBP:SLG	-570.441	1811.612	-0.315	0.75285
BA:OPS	14163.983	5449.796	2.599	0.00935 **
OBP:OPS	4637.993	896.160	5.175	2.28e-07 ***
SLG:OPS	2914.035	518.867	5.616	1.96e-08 ***
BA:G	3.622	3.755	0.965	0.33478
OBP:G	-8.139	10.444	-0.779	0.43577
SLG:G	-15.374	10.513	-1.462	0.14362
OPS:G	28.539	10.119	2.820	0.00480 **
BA:OBP:SLG	2271.455	6540.574	0.347	0.72838
BA:OBP:OPS	-10143.107	3083.565	-3.289	0.00100 **
BA:SLG:OPS	-8500.056	1788.444	-4.753	2.01e-06 ***
OBP:SLG:OPS	-7317.221	1333.474	-5.487	4.09e-08 ***
BA:OBP:G	65.839	38.504	1.710	0.08728 .
BA:SLG:G	70.900	38.919	1.822	0.06850 .
OBP:SLG:G	11.763	12.545	0.938	0.34842
BA:OPS:G	-105.006	37.307	-2.815	0.00488 **
OBP:OPS:G	-41.035	6.213	-6.605	3.99e-11 ***
SLG:OPS:G	-21.299	3.613	-5.894	3.77e-09 ***

```
## BA:OBP:SLG:OPS      19569.643    4426.246    4.421 9.82e-06 ***
## BA:OBP:SLG:G        -45.205     45.265   -0.999  0.31796
## BA:OBP:OPS:G        103.210     21.378    4.828 1.38e-06 ***
## BA:SLG:OPS:G         62.154     12.485    4.978 6.42e-07 ***
## OBP:SLG:OPS:G        54.673      9.344    5.851 4.90e-09 ***
## BA:OBP:SLG:OPS:G   -148.831     31.161   -4.776 1.79e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.949 on 155248 degrees of freedom
## Multiple R-squared:  0.1303, Adjusted R-squared:  0.1301
## F-statistic: 750 on 31 and 155248 DF, p-value: < 2.2e-16
```

```
par(mfrow=c(2,2))
plot(temp)
```



```
par(mfrow=c(1,1))
```

Comparing OBP of 1 and 2 vs the rest

```
obp12 <- dataset2[dataset2$lineupPosition < 3,]
obp12 <- obp12$OBP
summary(obp12)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##  0.243   0.322   0.342   0.343   0.362   0.460
```

```
obpNot12 <- dataset2[dataset2$lineupPosition > 2,]
obpNot12 <- obpNot12$OBP
summary(obp12)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##    0.243  0.322   0.342   0.343   0.362   0.460
```

```
t.test(obp12,obpNot12,alternative="greater", var.equal=TRUE)
```

```
##
## Two Sample t-test
##
## data:  obp12 and obpNot12
## t = 34.142, df = 155278, p-value < 2.2e-16
## alternative hypothesis: true difference in means is greater than 0
## 95 percent confidence interval:
##  0.005921176      Inf
## sample estimates:
## mean of x mean of y
## 0.3429749 0.3367540
```

```
#ggtttest(t.test(obp12,obpNot12,alternative="greater", var.equal=TRUE))
```

Comparing OPS of 3 vs the rest

```
ops3 <- dataset2[dataset2$lineupPosition == 3,]
ops3<- ops3$OPS
summary(ops3)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##    0.5860  0.7770  0.8350  0.8405  0.8990  1.1090
```

```
opsNot3 <- dataset2[dataset2$lineupPosition != 3,]
opsNot3 <- opsNot3$OPS
summary(opsNot3)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##    0.5390  0.7160  0.7660  0.7734  0.8250  1.1090
```

```
t.test(ops3,opsNot3,alternative="greater", var.equal=TRUE)
```

```
##
## Two Sample t-test
##
## data:  ops3 and opsNot3
## t = 121.61, df = 155278, p-value < 2.2e-16
## alternative hypothesis: true difference in means is greater than 0
## 95 percent confidence interval:
##  0.06624516      Inf
## sample estimates:
## mean of x mean of y
## 0.8405294 0.7733759
```

Comparing OPS of 3 vs 1 & 2

```
summary(ops3)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.5860  0.7770  0.8350  0.8405  0.8990  1.1090
```

```
ops12 <- dataset2[dataset2$lineupPosition < 3,]
ops12 <- ops12$OPS
summary(ops12)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.5390  0.7210  0.7710  0.7811  0.8310  1.1020
```

```
t.test(ops3,ops12,alternative="greater", var.equal=TRUE)
```

```
##
## Two Sample t-test
##
## data: ops3 and ops12
## t = 90.492, df = 76984, p-value < 2.2e-16
## alternative hypothesis: true difference in means is greater than 0
## 95 percent confidence interval:
## 0.05836313      Inf
## sample estimates:
## mean of x mean of y
## 0.8405294 0.7810857
```

Compare SLG of 4 & 5 vs Rest

```
slg4 <- dataset2[dataset2$lineupPosition == 4 | dataset2$lineupPosition == 5,]
slg4 <- slg4$SLG
summary(slg4)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.2960  0.4210  0.4570  0.4605  0.4990  0.6490
```

```
slgNot4 <- dataset2[dataset2$lineupPosition != 4,]
slgNot4 <- slgNot4$SLG
summary(slgNot4)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.2960  0.3990  0.4350  0.4429  0.4850  0.6720
```

```
t.test(slg4,slgNot4,alternative="greater",var.equal=TRUE)
```

```
##
## Two Sample t-test
##
```

```
## data: slg4 and slgNot4
## t = 51.459, df = 174893, p-value < 2.2e-16
## alternative hypothesis: true difference in means is greater than 0
## 95 percent confidence interval:
## 0.01705821      Inf
## sample estimates:
## mean of x mean of y
## 0.4605322 0.4429107
```

Comparing SLG of 4 & 5 to 1,2,3

```
slg123 <- dataset2[dataset2$lineupPosition <= 3,]
slg123 <- slg123$SLG
summary(slg123)
```

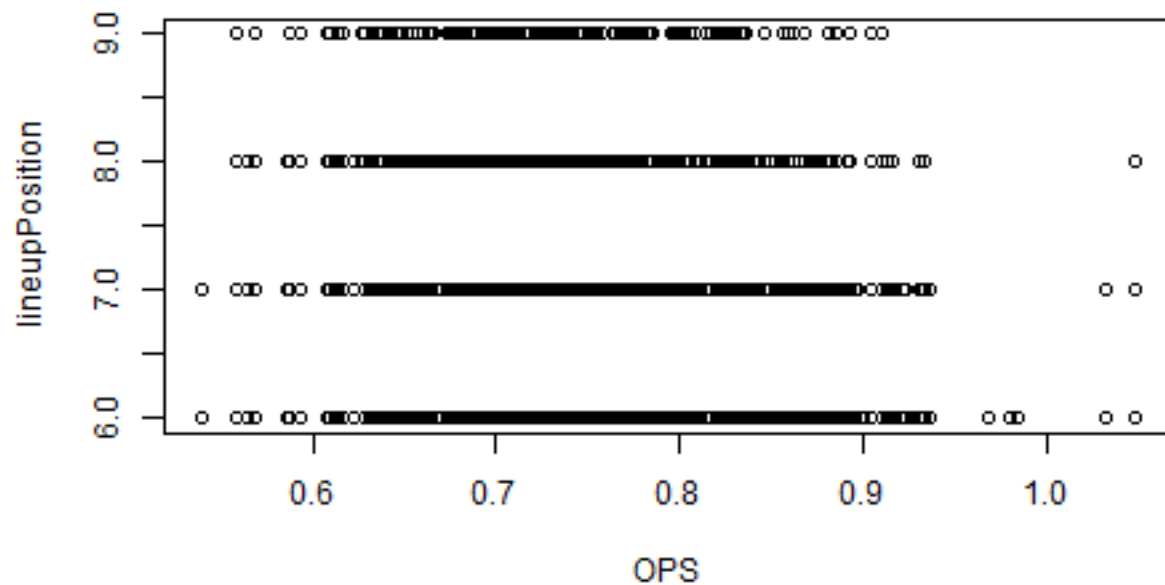
```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.2960  0.4060  0.4490  0.4547  0.5000  0.6720
```

```
t.test(slg4,slg123,alternative="greater",var.equal=TRUE)
```

```
##
## Two Sample t-test
##
## data: slg4 and slg123
## t = 15.371, df = 121419, p-value < 2.2e-16
## alternative hypothesis: true difference in means is greater than 0
## 95 percent confidence interval:
## 0.005183299      Inf
## sample estimates:
## mean of x mean of y
## 0.4605322 0.4547278
```

Check whether the rest of the lineup is ordered from best hitter to worst hitter

```
endOfLineup <- dataset2[dataset2$lineupPosition > 5,]
plot(lineupPosition ~ OPS,data=endOfLineup)
```



```
temp <- lm(lineupPosition ~ OPS,data=endOfLineup)
summary(temp)
```

```
##
## Call:
## lm(formula = lineupPosition ~ OPS, data = endOfLineup)
##
## Residuals:
```

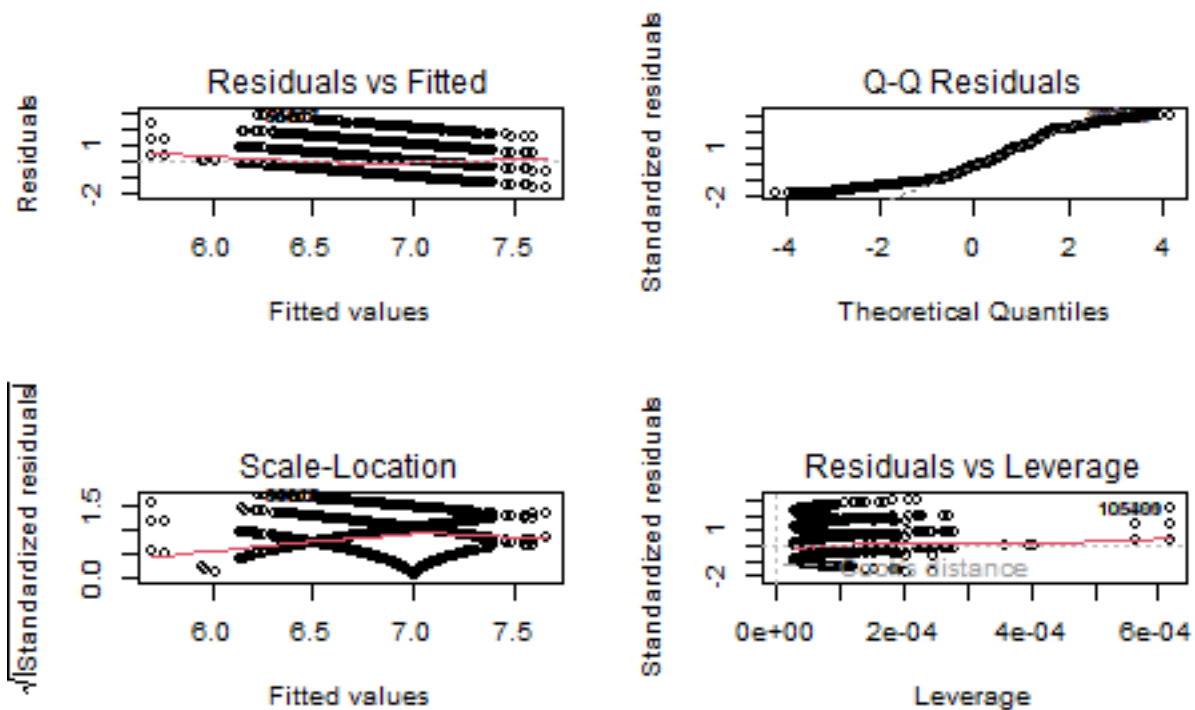
	Min	1Q	Median	3Q	Max
	-1.66917	-0.80137	-0.09064	0.67795	2.76559

```
##
## Coefficients:
```

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	9.74804	0.05170	188.54	<2e-16 ***
OPS	-3.85690	0.07036	-54.82	<2e-16 ***

```
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.9184 on 33857 degrees of freedom
## Multiple R-squared:  0.08153,    Adjusted R-squared:  0.0815
## F-statistic: 3005 on 1 and 33857 DF,  p-value: < 2.2e-16
```

```
par(mfrow=c(2,2))
plot(temp)
```



```
par(mfrow=c(1,1))
```

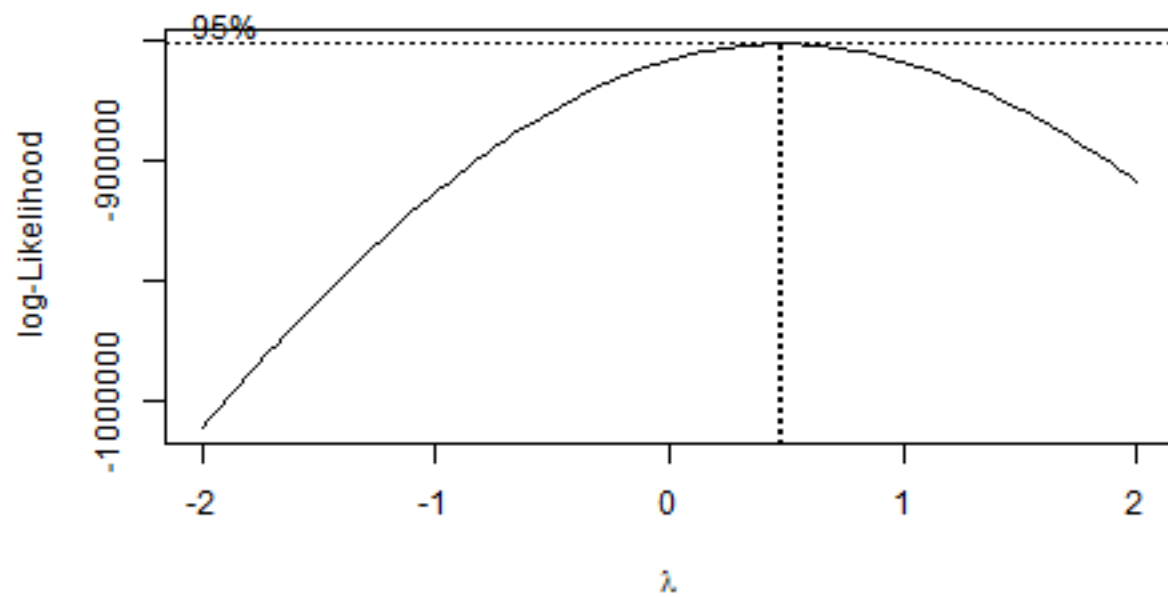
Attempt at Box-Cox Transformation (not used)

```
library(MASS)
```

```
##
## Attaching package: 'MASS'

## The following object is masked from 'package:dplyr':
##
##   select
```

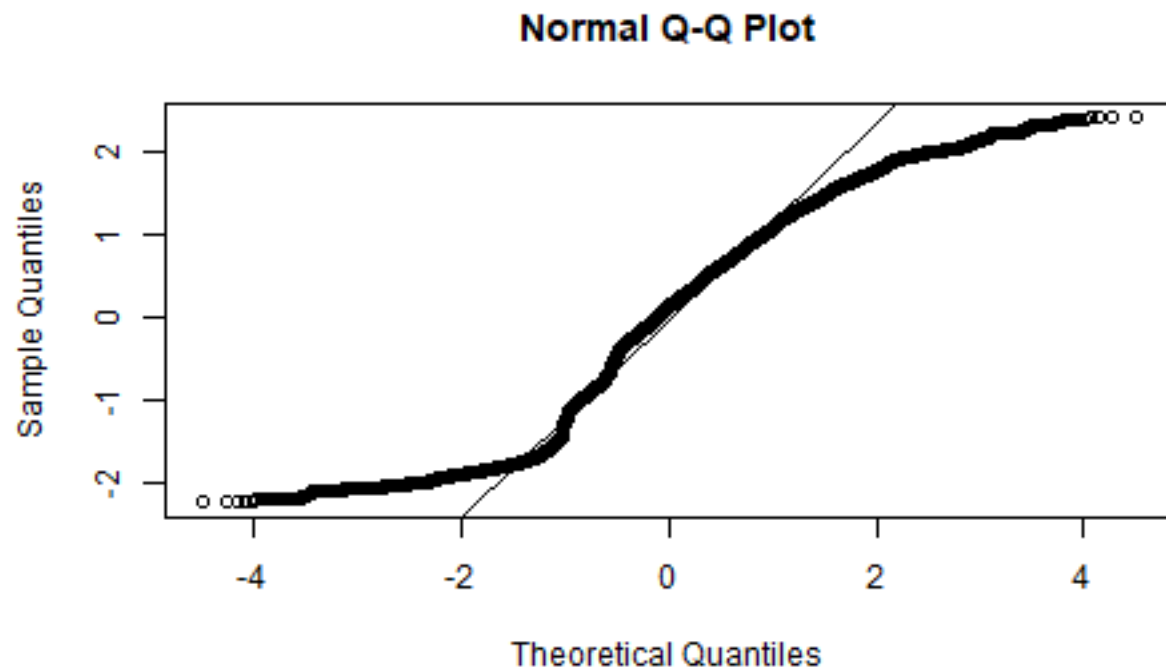
```
#qqPlot(sqrt(dataset2$OPSplus_alt))
#summary(dataset2$OPSplus_alt)
bc <- boxcox(lineupPosition ~ OPS, data=dataset2)
```

```
lambda <- bc$x[which.max(bc$y)]
print(lambda)
```

```
## [1] 0.4646465
```

```
temp2 <- lm(((lineupPosition^lambda-1)/lambda) ~ OPS, dataset2)
qqnorm(temp2$residuals)
qqline(temp2$residuals)
```



```
summary(temp2)
```

```
##
## Call:
## lm(formula = ((lineupPosition^lambda - 1)/lambda) ~ OPS, data = dataset2)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -2.2324 -0.8183  0.1357  0.7828  2.4109
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   3.42285    0.02352   145.56  <2e-16 ***
## OPS           -2.20856    0.02973   -74.29  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.042 on 155278 degrees of freedom
## Multiple R-squared:  0.03432,    Adjusted R-squared:  0.03432
## F-statistic: 5519 on 1 and 155278 DF,  p-value: < 2.2e-16
```