Lab 1

Rhea Abraham, worked with Varsha Murali

Due on 02/07 at 11:59 PM

Instructions: This lab report needs to be professional. Only report relevant and finalized code. Your writing should be concise and void of spelling errors. Use code chunk options to hide unnecessary messages/warnings. Your report should be reproducible. Reports that involve simulations need to have the random seed specified so that simulation results are reproducible. You are allowed to work on this lab assignment in groups of 2-3. You still need to submit an individual lab report if you do work in a group, and you need to list your collaborators.

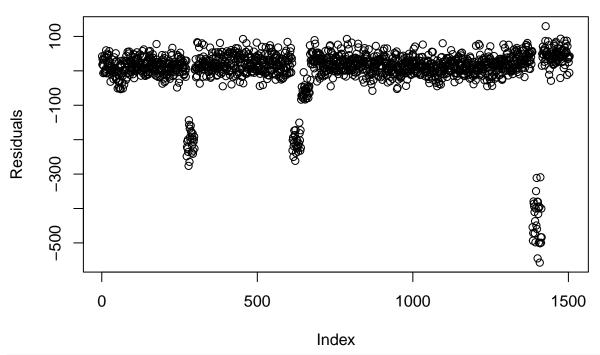
Question 1 In lecture it was demonstrated that baseball is a game of offense, pitching, and defense with a regression model that considered expected run differential as a function of explanatory variables OPS, WHIP, and FP. Do the following:

- Fit a similar regression model with runs as the response variable. Report problems with this model. Investigate problematic residuals to discover what went wrong. Fix the problem with this model by adding categorical variable(s) to the list of explanatory variables. Briefly explain what went wrong.
- We can significantly improve the regression model in the notes through a principled rescaling of OPS, WHIP, and FP. Split the Teams data frame by yearID and, for each year, create variables OPSscale = OPS/avgOPS, WHIPscale = avgWHIP/WHIP, and FPscale = FP/avgFP which require you to first create league average variables avgOPS, avgWHIP, and avgFP. Fit the linear regression model with runs differential as the response and explanatory variables OPSscale, WHIPscale, and FPscale, and report relevant output. Why does this model perform so much better than the model in the notes? Support your answer.

```
library(Lahman)
data(Batting)
data(Pitching)
data(Fielding)
data(Teams)
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
library(ggplot2)
library(retrosheet)
```

```
## For Retrosheet data obtained with this package:
## The information used here was obtained free of charge from
## and is copyrighted by Retrosheet. Interested parties may
## contact Retrosheet at "www.retrosheet.org"
library(baseballr)
Teams <- Teams %>%
  mutate(
   OBP = (H + BB + HBP) / (AB + BB + HBP + SF),
    SLG = (H + X2B + (2 * X3B) + (3 * HR)) / AB,
   OPS = OBP + SLG,
    WHIP = (BB + H) / (IPouts / 3)
  )
model1 <- lm(R ~ OPS + WHIP + FP, data = Teams)
summary(model1)
##
## Call:
## lm(formula = R ~ OPS + WHIP + FP, data = Teams)
## Residuals:
       Min
               1Q Median
                                3Q
                                       Max
## -557.30 -3.74 14.88 34.01 129.78
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) -678.966
                          615.873 -1.102
                                              0.270
## OPS
              1469.084
                          100.961 14.551 < 2e-16 ***
## WHIP
              232.833
                           49.781
                                    4.677 3.17e-06 ***
## FP
                -3.085
                           635.920 -0.005
                                              0.996
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 80.4 on 1500 degrees of freedom
     (1541 observations deleted due to missingness)
## Multiple R-squared: 0.5004, Adjusted R-squared: 0.4994
## F-statistic: 500.9 on 3 and 1500 DF, p-value: < 2.2e-16
plot(model1$residuals, main = "Residuals of Initial Model", ylab = "Residuals")
```

Residuals of Initial Model



```
Teams_clean <- Teams %>% filter(complete.cases(OPS, WHIP, FP, R))
Teams_clean <- Teams_clean %>% mutate(residuals = model1$residuals) %>% arrange(desc(abs(residuals))) %
print(Teams clean)
```

```
yearID lgID teamID franchID divID Rank G Ghome
                                                             L DivWin WCWin LgWin
##
                                                          W
## 1
        2020
                NL
                      NYN
                                NYM
                                         Ε
                                              4 60
                                                       29 26 34
                                                                      N
                                                                             N
## 2
                                              1 60
                                                       30 35 25
                                                                      Y
        2020
                NL
                      ATL
                                ATL
                                         Ε
                                                                             N
## 3
        2020
                NL
                      PHI
                                PHI
                                         Ε
                                              3 60
                                                       32 28 32
                                                                      N
                                                                             N
## 4
        2020
                NL
                      SFN
                                SFG
                                              3 60
                                                       33 29 31
                                                                             N
                                                                      N
## 5
        2020
                NL
                      LAN
                                LAD
                                              1 60
                                                       30 43 17
                                                                      Y
                                                                             N
                                         W
                                              2 60
                                                       31 33 27
## 6
        2020
                AL
                      NYA
                                NYY
                                         Ε
                                                                      N
                                                                             Y
## 7
        2020
                      BOS
                                BOS
                                         Ε
                                              5 60
                                                          24 36
                                                                                   N
                AL
                                                       31
                                                                      N
                                                                             N
## 8
        2020
                NL
                      WAS
                                WSN
                                         Ε
                                              4 60
                                                       33 26 34
                                                                      N
                                                                             N
## 9
        2020
                NL
                      SDN
                                SDP
                                              2 60
                                                       32 37 23
                                                                      N
                                                                             Y
                                                                                   N
                                                       31 26 34
## 10
        2020
                      LAA
                                ANA
                                         W
                                              4 60
                                                                      N
##
      WSWin
                                             SO SB CS HBP SF
                                                                       ERA CG SHO SV
               R
                   AB
                         H X2B X3B
                                        BB
                                                               RA
                                    HR
                                                                    ER
## 1
          N 286 2023 551
                          106
                                    86 197 498
                                                        45 13 308 284 4.98
                                 3 103 239
## 2
          N 348 2074 556
                          130
                                            573 23
                                                        23
                                                            7 288 257 4.41
                                                                                  4 13
##
            306 1948 500
                            90
                                10
                                    82 229
                                            480
                                                35
                                                        28 10 311 284 5.14
                                                                                  5 11
                                                     8
                          107
                                                        27 13 297 267 4.64
## 4
          N 299 2019 532
                                14
                                    81 195 499 19
                                                     8
                                                                                  0 13
## 5
          Y 349 2042 523
                            97
                                 6 118 228 471 29
                                                     8
                                                        30 12 213 181 3.02
                                                                                  5 15
                                                        30 11 270 242 4.35
                                                                                  2 14
## 6
          N 315 1915 473
                            87
                                 7
                                    94 251 480 27
                                                     7
                                                            9 351 325 5.58
##
          N 292 2083 552 118
                                 7
                                    81 187 545 31
                                                     9
                                                        21
                                                                                  2 14
## 8
          N 293 1968 519 112
                                    66 192 451 33 12
                                                        32 21 301 285 5.09
                                                                                  3 12
                                12
## 9
          N 325 1972 506
                          103
                                12
                                    95 204 479 55
                                                   13
                                                        28 14 241 223 3.86
                                                                                  5 13
                                    85 239
          N 294 2020 501
                            97
                                 8
                                            490 21
                                                        25 18 321 297 5.09
                                                                                  2 12
##
                                                    8
##
              HA HRA BBA SOA
                                E DP
                                         FΡ
      IPouts
                                                                       name
                   81 219 574 32 39 0.985
## 1
        1540 511
                                                             New York Mets
## 2
        1573 494
                   69 220 506 33 52 0.985
                                                            Atlanta Braves
## 3
        1491 550
                   80 185 532 35 57 0.983
                                                     Philadelphia Phillies
```

```
## 4
        1553 474 69 210 488 41 43 0.980
                                                   San Francisco Giants
                  66 145 517 40 46 0.982
## 5
        1616 424
                                                    Los Angeles Dodgers
## 6
        1502 455
                  83 168 528 48 37 0.976
                                                       New York Yankees
                                                          Boston Red Sox
## 7
        1572 587
                  98 252 537 45 59 0.979
## 8
        1511 548
                  94 216 508 39 48 0.981
                                                   Washington Nationals
## 9
        1561 456
                  70 170 565 32 46 0.985
                                                       San Diego Padres
        1576 492 82 199 523 36 36 0.983 Los Angeles Angels of Anaheim
## 10
                           park attendance BPF PPF teamIDBR teamIDlahman45
##
## 1
                    Citi Field
                                         0 94 94
                                                         NYM
## 2
                                         0 107 106
                 SunTrust Park
                                                         ATL
                                                                        ATL
## 3
            Citizens Bank Park
                                         0 101 101
                                                         PHI
                                                                        PHI
## 4
                                         0 94
                                                95
                                                         SFG
                                                                        SFN
                   Oracle Park
## 5
                Dodger Stadium
                                         0
                                            97
                                                94
                                                        LAD
                                                                        LAN
                                            98 96
## 6
            Yankee Stadium III
                                         0
                                                         NYY
                                                                        NYA
## 7
                                         0 105 105
                                                                        BOS
                Fenway Park II
                                                         BOS
## 8
                Nationals Park
                                         0 103 102
                                                         WSN
                                                                        MON
## 9
                                            94 95
                                         Ω
                                                         SDP
                                                                        SDN
                    Petco Park
  10 Angel Stadium of Anaheim
                                         0 100 101
                                                        LAA
                                                                        ANA
                                             OPS
                                                     WHIP residuals
##
      teamIDretro
                        OBP
                                   SLG
## 1
              NYN 0.3481124 0.4592190 0.8073314 1.457143 -557.3032
## 2
              ATL 0.3491251 0.4826422 0.8317673 1.516211 -544.9547
## 3
              PHI 0.3417607 0.4394251 0.7811858 1.466801 -501.1480
              SFN 0.3345164 0.4507182 0.7852346 1.404379 -499.5714
## 4
              LAN 0.3378028 0.4828599 0.8206627 1.394183 -499.2382
## 5
## 6
              NYA 0.3416402 0.4469974 0.7886376 1.446072 -498.2907
## 7
              BOS 0.3304348 0.4450312 0.7754660 1.410305 -493.6035
## 8
              WAS 0.3357433 0.4334350 0.7691783 1.411648 -483.6728
              SDN 0.3327322 0.4655172 0.7982494 1.364510 -483.3931
## 9
              ANA 0.3323197 0.4301980 0.7625177 1.408629 -472.1789
## 10
model2 <- lm(R ~ OPS + WHIP + FP + factor(yearID) + factor(lgID), data = Teams)</pre>
summary(model2)
##
## Call:
## lm(formula = R ~ OPS + WHIP + FP + factor(yearID) + factor(lgID),
       data = Teams)
##
##
## Residuals:
        Min
                  10
                       Median
                                     30
                                             Max
##
  -121.758 -16.179
                       -0.625
                                 15.774 130.531
##
## Coefficients:
                       Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                      -914.7783
                                   246.2386
                                            -3.715 0.000211 ***
## OPS
                                    40.3503 39.253 < 2e-16 ***
                      1583.8870
## WHIP
                       177.7173
                                    19.7382
                                              9.004 < 2e-16 ***
## FP
                                   254.3895
                                              1.021 0.307375
                       259.7588
## factor(yearID)1971
                       -18.7843
                                     7.4105
                                             -2.535 0.011355 *
## factor(yearID)1972
                       -40.9070
                                     7.4417
                                             -5.497 4.56e-08 ***
## factor(yearID)1973
                        -8.0063
                                     7.3751
                                             -1.086 0.277848
                                     7.3957
## factor(yearID)1974
                        -3.8910
                                             -0.526 0.598886
## factor(yearID)1975
                        -9.1275
                                     7.4077
                                             -1.232 0.218085
## factor(yearID)1976
                        -2.6751
                                     7.4009
                                            -0.361 0.717815
## factor(yearID)1977
                       -13.1326
                                     7.2481
                                             -1.812 0.070215 .
```

```
-3.020 0.002569 **
## factor(yearID)1978
                       -21.8414
                                     7.2314
## factor(yearID)1979
                       -12.4762
                                     7.2379
                                             -1.724 0.084971 .
## factor(yearID)1980
                       -13.6271
                                     7.2294
                                             -1.885 0.059636
                                     7.2538 -32.040 < 2e-16 ***
## factor(yearID)1981 -232.4101
## factor(yearID)1982
                        -7.5106
                                     7.2380
                                             -1.038 0.299598
## factor(yearID)1983
                        -8.5068
                                     7.2337
                                             -1.176 0.239790
## factor(yearID)1984
                        -6.5044
                                     7.2304
                                             -0.900 0.368485
## factor(yearID)1985
                        -5.8731
                                     7.2411
                                             -0.811 0.417455
## factor(yearID)1986
                        -5.9130
                                     7.2401
                                             -0.817 0.414236
## factor(yearID)1987
                        -1.5062
                                     7.2867
                                             -0.207 0.836271
## factor(yearID)1988
                        -2.1722
                                     7.2731
                                             -0.299 0.765240
## factor(yearID)1989
                        -2.5091
                                     7.2506
                                             -0.346 0.729355
                                     7.2541
## factor(yearID)1990
                       -12.0333
                                             -1.659 0.097370
## factor(yearID)1991
                         1.3341
                                     7.2699
                                              0.184 0.854423
## factor(yearID)1992
                       -13.9540
                                     7.2854
                                             -1.915 0.055648
## factor(yearID)1993
                         -2.7919
                                     7.1369
                                             -0.391 0.695717
## factor(yearID)1994 -236.6294
                                     7.2058 -32.839 < 2e-16 ***
## factor(yearID)1995
                                     7.1879 -12.077 < 2e-16
                       -86.8077
                                              1.151 0.249988
                         8.2991
                                     7.2113
## factor(yearID)1996
## factor(yearID)1997
                       -13.3152
                                     7.2032
                                             -1.849 0.064731
## factor(yearID)1998
                        -5.4517
                                     7.1148
                                             -0.766 0.443650
## factor(yearID)1999
                        -6.0313
                                     7.1447
                                             -0.844 0.398719
                        -3.8355
                                     7.1634
                                             -0.535 0.592439
## factor(yearID)2000
                       -10.0250
## factor(yearID)2001
                                     7.2061
                                             -1.391 0.164386
## factor(yearID)2002
                       -18.7459
                                     7.1641
                                             -2.617 0.008972 **
## factor(yearID)2003
                       -11.5873
                                     7.1959
                                             -1.610 0.107559
## factor(yearID)2004
                       -14.6691
                                     7.2145
                                             -2.033 0.042205
                       -22.9757
                                             -3.180 0.001505 **
## factor(yearID)2005
                                     7.2257
## factor(yearID)2006
                       -17.8600
                                     7.2446
                                             -2.465 0.013806 *
                                     7.2018
## factor(yearID)2007
                       -10.7948
                                             -1.499 0.134119
## factor(yearID)2008
                       -18.3743
                                     7.1929
                                             -2.555 0.010735 *
## factor(yearID)2009
                       -25.9287
                                     7.2243
                                             -3.589 0.000343 ***
## factor(yearID)2010
                       -19.4898
                                     7.1708
                                             -2.718 0.006648 **
                                     7.2150
                                             -2.333 0.019768 *
## factor(yearID)2011
                       -16.8349
                                     7.2694
## factor(yearID)2012
                       -16.4533
                                             -2.263 0.023761 *
## factor(yearID)2013
                       -24.3991
                                     7.3261
                                             -3.330 0.000889 ***
## factor(yearID)2014
                       -14.0973
                                     7.2880
                                             -1.934 0.053270
## factor(yearID)2015
                       -22.1163
                                     7.3689
                                             -3.001 0.002734 **
## factor(yearID)2016
                       -18.5805
                                     7.3568
                                             -2.526 0.011655 *
## factor(yearID)2017
                       -11.8427
                                     7.3776
                                             -1.605 0.108665
## factor(yearID)2018
                        -0.6412
                                     7.3638
                                             -0.087 0.930629
## factor(yearID)2019
                         8.1382
                                     7.4656
                                              1.090 0.275853
## factor(yearID)2020 -465.1263
                                     7.3100 -63.629 < 2e-16 ***
## factor(yearID)2021
                        12.6941
                                     7.4229
                                              1.710 0.087455
## factor(yearID)2022
                        12.4860
                                     7.4333
                                              1.680 0.093225
## factor(yearID)2023
                         13.4136
                                     7.4389
                                              1.803 0.071568
## factor(lgID)NL
                         -5.8805
                                     1.3600
                                            -4.324 1.64e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 25.53 on 1446 degrees of freedom
     (1541 observations deleted due to missingness)
## Multiple R-squared: 0.9514, Adjusted R-squared: 0.9495
## F-statistic: 496.9 on 57 and 1446 DF, p-value: < 2.2e-16
```

```
Teams <- Teams %>% group_by(yearID) %>%
  mutate(
    avgOPS = mean(OPS, na.rm = TRUE),
    avgWHIP = mean(WHIP, na.rm = TRUE),
    avgFP = mean(FP, na.rm = TRUE),
    OPSscale = OPS / avgOPS,
   WHIPscale = avgWHIP / WHIP,
    FPscale = FP / avgFP
  )
model3 <- lm(R ~ OPSscale + WHIPscale + FPscale, data = Teams)
summary(model3)
##
## Call:
## lm(formula = R ~ OPSscale + WHIPscale + FPscale, data = Teams)
##
## Residuals:
##
      Min
                1Q Median
                                3Q
                                       Max
## -549.99 -28.35
                      9.85
                             52.63
                                    200.24
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
               -463.85
                            922.20
                                    -0.503 0.61505
## OPSscale
                1146.50
                            106.87
                                    10.728
                                           < 2e-16 ***
## WHIPscale
                -263.96
                             97.87
                                    -2.697 0.00707 **
## FPscale
                 286.40
                            908.42
                                     0.315
                                           0.75259
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 93.09 on 1500 degrees of freedom
     (1541 observations deleted due to missingness)
## Multiple R-squared: 0.3304, Adjusted R-squared:
## F-statistic: 246.7 on 3 and 1500 DF, p-value: < 2.2e-16
```

Question 2 Choose 3 batters and 3 pitchers that have played in at least 10 seasons and do the following:

- Display the seasonal statistics for these players. The following statistics should be included for batters (derivations of unconventional statistics are in parentheses): year, G, AB, R, H, X2B, X3B, HR, RBI, SB, CS, SBpct (SB / (SB + CS)), BB, SO, OBP, SLG, OPS. The following statistics should be included for pitchers: year, W, L, IPouts, H, ER, HR, BB, HBP, SO, ERA, WHIP, SOper9 (SO / IP * 9), SOperBB (SO / BB). These statistics can be found in or computed from statistics that are found in the Batting and Pitching dataframes in the Lahman package.
- Create career stat lines for each of the players that you selected. Be careful about how these statistics are calculated.
- Provide a plot for career trajectories for one batting and one pitching statistic of your choice. These are two separate graphics, one for the batters and one for the pitchers. The graphics that you produce should display the trajectories of the 3 batters and the 3 pitchers. Provide interesting commentary on your graphic.

```
library(Lahman)
library(dplyr)
library(ggplot2)
```

```
batters <- Batting %>%
  group_by(playerID) %>%
  filter(n_distinct(yearID) >= 10) %>%
  summarise(total G = sum(G), total HR = sum(HR)) %>%
  arrange(desc(total_HR)) %>%
  slice(1:3) %>%
  pull(playerID)
pitchers <- Pitching %>%
  group_by(playerID) %>%
  filter(n_distinct(yearID) >= 10) %>%
  summarise(total_W = sum(W), total_SO = sum(SO)) %>%
  arrange(desc(total_S0)) %>%
  slice(1:3) %>%
  pull(playerID)
batting_stats <- Batting %>%
  filter(playerID %in% batters) %>%
  mutate(SBpct = SB / (SB + CS),
         OBP = (H + BB) / (AB + BB),
         SLG = (H + X2B + 2 * X3B + 3 * HR) / AB,
         OPS = OBP + SLG) \%
  select(playerID, yearID, G, AB, R, H, X2B, X3B, HR, RBI, SB, CS, SBpct, BB, SO, OBP, SLG, OPS)
pitching_stats <- Pitching %>%
  filter(playerID %in% pitchers) %>%
  mutate(ERA = (ER / IPouts) * 27,
         WHIP = (BB + H) / (IPouts / 3),
         SOper9 = (SO / (IPouts / 3)) * 9,
         SOperBB = SO / BB) %>%
  select(playerID, yearID, W, L, IPouts, H, ER, HR, BB, HBP, SO, ERA, WHIP, SOper9, SOperBB)
career_batting <- batting_stats %>%
  group_by(playerID) %>%
  summarise(across(where(is.numeric), sum, na.rm = TRUE))
## Warning: There was 1 warning in `summarise()`.
## i In argument: `across(where(is.numeric), sum, na.rm = TRUE)`.
## i In group 1: `playerID = "aaronha01"`.
## Caused by warning:
## ! The `...` argument of `across()` is deprecated as of dplyr 1.1.0.
## Supply arguments directly to `.fns` through an anonymous function instead.
##
##
     # Previously
##
     across(a:b, mean, na.rm = TRUE)
##
##
     across(a:b, \xspace (x, na.rm = TRUE))
##
career_pitching <- pitching_stats %>%
  group_by(playerID) %>%
  summarise(across(where(is.numeric), sum, na.rm = TRUE))
batting_plot <- ggplot(batting_stats, aes(x = yearID, y = OPS, color = playerID)) +
```

```
geom_line() +
  geom_point() +
  labs(title = "OPS Career Trajectory of Selected Batters", x = "Year", y = "OPS") +
pitching_plot <- ggplot(pitching_stats, aes(x = yearID, y = SOper9, color = playerID)) +</pre>
  geom_line() +
  geom point() +
  labs(title = "Strikeouts Per 9 Innings Career Trajectory of Selected Pitchers", x = "Year", y = "SO p
  theme minimal()
print(batting_stats)
                           G
                                        H X2B X3B HR RBI SB CS
                                                                            BB
                                                                                SO
       playerID yearID
                             AΒ
                                   R
                                                                     SBpct
## 1
                   1954 122 468
                                  58 131
                                                           2
                                                              2 0.5000000
                                                                            28
                                                                                39
      aaronha01
                                           27
                                                  13
                                                       69
## 2
      aaronha01
                   1955 153 602 105 189
                                                  27 106
                                                              1 0.7500000
                                                                                 61
## 3
      aaronha01
                   1956 153 609 106 200
                                                  26
                                                           2
                                                              4 0.3333333
                                                                                54
                                           34
                                               14
                                                       92
                                                                            37
## 4
      aaronha01
                   1957 151 615 118 198
                                           27
                                                6
                                                  44
                                                     132
                                                           1
                                                              1 0.5000000
                                                                            57
                                                                                58
## 5
                   1958 153 601 109 196
                                           34
                                                  30
                                                       95
                                                              1 0.8000000
                                                                            59
                                                                                49
      aaronha01
                                                           4
## 6
      aaronha01
                   1959 154 629 116 223
                                           46
                                                7 39 123
                                                           8
                                                              0 1.0000000
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## 12 aaronha01
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2 0.8181818 198

31

2002 143 403 117 149

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## 45 bondsba01
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                                                                                54
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                                                                             O
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                                                                             9
## 47
       ruthba01
                   1915
                         42
                             92
                                  16
                                      29
                                          10
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                                                   4
                                                      21
                                                          O NA
                                                                       NA
                                                                                23
## 48
       ruthba01
                   1916
                         67 136
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                                                   3
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## 49
       ruthba01
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                         52 123
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                                                3
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                                                          O NA
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## 50
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## 55
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## 62
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## 63
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## 18 0.4116608 0.6686869 1.0803476
## 19 0.3900185 0.5144766 0.9044951
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## 47 0.3762376 0.5760870 0.9523246
## 48 0.3219178 0.4191176 0.7410355
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## 50 0.4080000 0.5552050 0.9632050
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## 58 0.5133020 0.7373737 1.2506758
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                  1991 18 10
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66 11

95 17

62

67

9 208

11 160

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4.460870 1.2626087

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575 175

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clemero02

10 clemero02

1992 18 11

1993 11 14

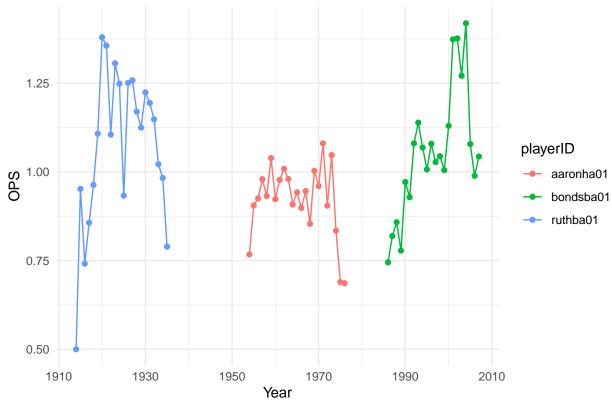
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                                             46 12
                                                           4 133
##
       ryanno01
                    1968
                          6
                              9
                                         93
                                                     75
                                                                  3.089552 1.2537313
   50
##
   51
       ryanno01
                    1969
                          6
                              3
                                   268
                                         60
                                             35
                                                  3
                                                     53
                                                                  3.526119 1.2649254
                    1970
                          7 11
                                   395
                                         86
                                             50 10
                                                     97
                                                             125
                                                                  3.417722 1.3898734
##
   52
       ryanno01
                                                           4
##
   53
       ryanno01
                    1971 10 14
                                   456 125
                                             67
                                                 8
                                                    116
                                                          15
                                                             137
                                                                  3.967105 1.5855263
##
                    1972 19 16
                                             72 14
                                                          10
                                                             329
                                                                  2.281690 1.1373239
   54
       ryanno01
                                   852
                                       166
                                                    157
##
   55
       ryanno01
                    1973 21 16
                                   978 238 104 18 162
                                                             383
                                                                  2.871166 1.2269939
                    1974 22 16
                                   998 221 107 18
                                                    202
                                                           9
                                                             367
                                                                  2.894790 1.2715431
##
   56
       ryanno01
##
   57
       ryanno01
                    1975 14 12
                                   594 152
                                             76 13 132
                                                           7
                                                             186
                                                                  3.454545 1.4343434
##
   58
       ryanno01
                    1976 17 18
                                   853 193 106 13 183
                                                             327
                                                                  3.355217 1.3223916
                                   897 198
##
   59
                    1977 19 16
                                             92
                                                12 204
                                                           9
                                                             341
                                                                  2.769231 1.3444816
       ryanno01
##
   60
                    1978 10 13
                                   704
                                       183
                                             97
                                                 12
                                                    148
                                                           3
                                                             260
                                                                  3.720170 1.4105114
       ryanno01
                                                15 114
                                                             223
##
                    1979 16 14
                                   668
                                       169
                                             89
                                                           6
                                                                  3.597305 1.2709581
   61
       ryanno01
                                                           3 200
   62
       ryanno01
                    1980 11 10
                                   701 205
                                             87 10
                                                     98
                                                                  3.350927 1.2967190
       ryanno01
                    1981 11
                                   447
                                        99
                                             28
                                                 2
                                                     68
                                                           1 140
                                                                  1.691275 1.1208054
##
  63
                             5
## 64
       ryanno01
                    1982 16 12
                                   751 196
                                             88 20 109
                                                           8 245
                                                                  3.163782 1.2183755
```

```
## 65
      ryanno01
                   1983 14 9
                                 589 134
                                           65 9 101
                                                       4 183
                                                               2.979626 1.1969440
## 66
       ryanno01
                   1984 12 11
                                 551 143
                                           62 12
                                                  69
                                                       4 197
                                                               3.038113 1.1542650
                   1985 10 12
## 67
       ryanno01
                                 696 205
                                           98 12
                                                       9 209
                                                               3.801724 1.2931034
## 68
       ryanno01
                   1986 12
                           8
                                 534 119
                                           66 14
                                                  82
                                                       4 194
                                                               3.337079 1.1292135
## 69
       ryanno01
                   1987
                         8 16
                                 635 154
                                           65 14
                                                  87
                                                       4 270
                                                               2.763780 1.1385827
## 70
       ryanno01
                   1988 12 11
                                           86 18
                                                  87
                                                       7 228
                                                               3.518182 1.2409091
                                 660 186
       ryanno01
                   1989 16 10
                                           85 17
                                                  98
                                                       9 301
                                                               3.196379 1.0863510
## 71
                                 718 162
       ryanno01
                                                  74
                                                       7 232
## 72
                   1990 13
                            9
                                 612 137
                                           78 18
                                                               3.441176 1.0343137
## 73
       ryanno01
                   1991 12
                            6
                                 519 102
                                           56 12
                                                  72
                                                       5 203
                                                               2.913295 1.0057803
## 74
                                           65
                                               9
                                                  69
       ryanno01
                   1992
                        5
                            9
                                 472 138
                                                       12 157
                                                               3.718220 1.3156780
       ryanno01
   75
                   1993
                         5
                            5
                                 199
                                       54
                                           36
                                               5
                                                  40
                                                           46
                                                              4.884422 1.4170854
##
         SOper9
                  SOperBB
       8.505000 4.344828
## 1
## 2
       6.772881 2.000000
## 3
       8.433071 3.552239
## 4
       8.179882 3.084337
## 5
       9.920455 4.693548
##
       8.171053 2.473118
##
       8.237956 3.870370
  7
## 8
       7.993857 3.707692
## 9
       7.589189 3.354839
       7.513043 2.388060
## 11
       8.859375 2.366197
## 12
       8.485714 2.200000
## 13
       9.531593 2.424528
## 14
       9.954545 4.294118
## 15 10.393466 3.079545
       7.817052 1.811111
   16
## 17
       8.280587 2.238095
## 18
       8.700454 2.958333
## 19
       9.600000 3.047619
   20
       8.078740 3.275862
##
       9.153966 2.759494
  22
       7.878549 2.983871
##
  23
       8.100000 3.517241
##
       6.181818 2.193548
  24
## 25
       8.653846 3.571429
## 26
       7.887640 1.000000
## 27
       7.145038 1.485714
       7.948407 1.616667
## 29 10.192053 1.500000
## 30 10.312203 1.673611
## 31 10.856397 3.111111
## 32 10.674419 2.833333
## 33 12.345257 4.523077
## 34 12.472826 3.400000
## 35 12.295775 3.779221
## 36 11.981250 3.550000
## 37 12.379447 4.461538
## 38 12.058896 5.200000
## 39 12.558981 4.565789
## 40 13.409880 5.239437
## 41 11.561538 4.704225
## 42 9.868421 4.629630
```

```
## 43 10.624152 6.590909
## 44 8.415066 4.489362
## 45 7.551220 2.866667
## 46 11.435294 5.538462
## 47 8.461957 3.931818
## 48 8.062500 2.774194
## 49 18.000000 2.000000
## 50 8.932836 1.773333
## 51
      9.268657 1.735849
## 52 8.544304 1.288660
## 53 8.111842 1.181034
## 54 10.426056 2.095541
## 55 10.573620 2.364198
## 56 9.928858 1.816832
## 57 8.454545 1.409091
## 58 10.350528 1.786885
## 59 10.264214 1.671569
## 60
     9.971591 1.756757
## 61
     9.013473 1.956140
## 62
      7.703281 2.040816
## 63 8.456376 2.058824
     8.808256 2.247706
     8.388795 1.811881
## 65
      9.653358 2.855072
## 67
      8.107759 2.200000
## 68 9.808989 2.365854
## 69 11.480315 3.103448
## 70 9.327273 2.620690
## 71 11.318942 3.071429
## 72 10.235294 3.135135
## 73 10.560694 2.819444
## 74 8.980932 2.275362
## 75 6.241206 1.150000
print(career_batting)
## # A tibble: 3 x 18
                                              X2B
                                                                             CS
##
    playerID yearID
                         G
                              AB
                                    R
                                          Η
                                                    хзв
                                                           HR
                                                                RBI
                                                                       SB
     <chr>>
               ## 1 aaronha01 45195 3298 12364 2174 3771
                                              624
                                                     98
                                                          755
                                                               2297
                                                                      240
                                                                            73
## 2 bondsba01 43923 2986 9847
                                 2227
                                       2935
                                              601
                                                     77
                                                          762
                                                              1996
                                                                      514
                                                                            141
               42339 2503 8398 2174 2873
## 3 ruthba01
                                              506
                                                    136
                                                          714
                                                               2217
                                                                      123
## # i 6 more variables: SBpct <dbl>, BB <int>, SO <int>, OBP <dbl>, SLG <dbl>,
      OPS <dbl>
print(career_pitching)
## # A tibble: 3 x 15
                                                                        SO
    playerID yearID
                                                                            ERA
                         W
                                                ER
                                                      HR
                                                            BB
                                                                 HBP
                              L IPouts
                                           Н
     <chr>>
               <int> 
## 1 clemero02 47892
                       354
                             184 14750
                                        4185
                                              1707
                                                     363
                                                          1580
                                                                 159
                                                                      4672
                                                                           77.3
## 2 johnsra05 47954
                       303
                             166 12406
                                        3346
                                             1513
                                                     411
                                                          1497
                                                                 190
                                                                     4875
                                                                           83.5
## 3 ryanno01
                       324
                             292 16158 3923 1911
                                                          2795
                                                                 158 5714 99.7
               53459
                                                     321
## # i 3 more variables: WHIP <dbl>, SOper9 <dbl>, SOperBB <dbl>
```

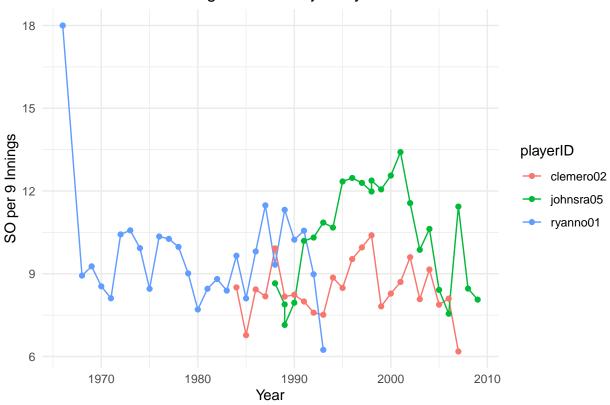
print(batting_plot)





print(pitching_plot)

Strikeouts Per 9 Innings Career Trajectory of Selected Pitchers



Question 3 Exercise 1.2 in the online version of Analyzing Baseball Data with R. Exercise 2 on page 27 of the textbook.

```
gibson_1968 <- Pitching %>%
  filter(playerID == "gibsobo01", yearID == 1968)
fraction_completed <- gibson_1968$CG / gibson_1968$GS</pre>
strikeout_to_walk_ratio <- gibson_1968$BB / gibson_1968$BB
innings_pitched <- gibson_1968$IPouts / 3</pre>
WHIP <- (gibson_1968$BB + gibson_1968$H) / innings_pitched
list(
  fraction_completed = fraction_completed,
  strikeout_to_walk_ratio = strikeout_to_walk_ratio,
  innings_pitched = innings_pitched,
  WHIP = WHIP
)
## $fraction_completed
## [1] 0.8235294
## $strikeout_to_walk_ratio
## [1] 4.322581
##
## $innings_pitched
## [1] 304.6667
##
```

```
## [1] 0.8533917
Question 4 Exercise 1.3 in the online version of Analyzing Baseball Data with R. Exercise 3 on page 27 of
the textbook.
library(readr)
library(dplyr)
file path <- "/Users/Rhea/Desktop/stat430/sp25 stat430 rheaaa2/rhea labs/lab1/gl1964.txt"
column_names <- c(</pre>
  "Date", "DoubleHeader", "DayOfWeek", "VisitingTeam", "VisitingTeamLeague",
  "VisitingTeamGameNumber", "HomeTeam", "HomeTeamLeague", "HomeTeamGameNumber",
  "VisitorRunsScored", "HomeRunsScore", "LengthInOuts", "DayNight",
  "CompletionInfo", "ForfeitInfo", "ProtestInfo", "ParkID", "Attendance",
  "Duration", "VisitorLineScore", "HomeLineScore", "VisitorAB", "VisitorH",
  "VisitorD", "VisitorT", "VisitorHR", "VisitorRBI", "VisitorSH", "VisitorSF",
  "VisitorHBP", "VisitorBB", "VisitorIBB", "VisitorK", "VisitorSB",
  "VisitorCS", "VisitorGDP", "VisitorCI", "VisitorLOB"
game_logs <- read_csv(file_path, col_names = column_names)</pre>
## Warning: One or more parsing issues, call `problems()` on your data frame for details,
## e.g.:
##
    dat <- vroom(...)</pre>
    problems(dat)
##
## Rows: 1626 Columns: 161
## -- Column specification -----
## Delimiter: ","
## chr (74): DayOfWeek, VisitingTeam, VisitingTeamLeague, HomeTeam, HomeTeamLea...
## dbl (83): Date, DoubleHeader, VisitingTeamGameNumber, HomeTeamGameNumber, Vi...
## lgl (4): CompletionInfo, ForfeitInfo, X86, X88
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
game <- game_logs %>%
 filter(Date == "19640621", VisitingTeam == "PHI", HomeTeam == "NYN")
game_duration <- as.numeric(game$Duration)</pre>
game_hours <- game_duration %/% 60</pre>
game_minutes <- game_duration %% 60</pre>
cat("Game Duration:", game_hours, "hours", game_minutes, "minutes\n")
## Game Duration: 2 2 hours 19 51 minutes
cat("The attendance value is likely zero due to missing or unrecorded data in the log.\n")
## The attendance value is likely zero due to missing or unrecorded data in the log.
extra_base_hits <- as.numeric(game$VisitorD) + as.numeric(game$VisitorT) + as.numeric(game$VisitorHR)
cat("Phillies' Extra-Base Hits:", extra base hits, "\n")
## Phillies' Extra-Base Hits: 3 4
```

\$WHIP

```
visitor_hits <- as.numeric(game$VisitorH)
visitor_walks <- as.numeric(game$VisitorBB)
visitor_hit_by_pitch <- as.numeric(game$VisitorHBP)
visitor_at_bats <- as.numeric(game$VisitorAB)
visitor_sacrifice_flies <- as.numeric(game$VisitorSF)

OBP <- (visitor_hits + visitor_walks + visitor_hit_by_pitch) / (visitor_at_bats + visitor_walks + visitor_
```

Phillies' On-Base Percentage: 0.333 0.381