Project 1

Ashton Passmore

2023-03-26

```
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(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.2
## --
## v ggplot2 3.4.0
                  v purrr
                             1.0.1
## v tibble 3.1.8
                   v stringr 1.5.0
          1.3.0
## v tidyr
                    v forcats 1.0.0
## v readr
          2.1.3
## -- Conflicts ----- tidyverse conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                  masks stats::lag()
library(ggplot2)
library(Lahman)
```

Data set information

The data set that I chose for this project is the teams data set from the Lahman package.

Warning: package 'Lahman' was built under R version 4.2.3

This data set has 2985 observations and 48 variables and it gives yearly statistics for Major League Baseball teams from 1871 - 2021.

The problem I want to solve is I want to know how many home runs each team will give up in 2022 based on data from 2005-2021. I'm predicting for 2022 because it's not in the data set yet and since the season is over I can manually feed the independent variable information into the model I'm going to make to hopefully accurately predict how many home runs a team will give up in 2022. Afterwards I will check my predictions against the real number of home runs team gave up in 2022 to see how accurate my model is. (I'm starting in 2005 because pre 2005 there was a problem in baseball with steroid use and this inflated home runs allowed by a significant margin and all the teams from 2005 are the same teams as today.)

Cleaning

filter data set to only give data from 2005-2021

```
revisedTeams <- Teams %>%
filter(yearID >= 2005)
head(revisedTeams)
```

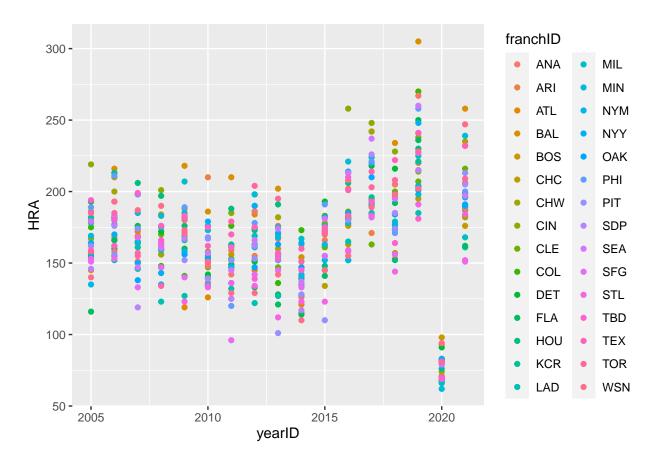
```
##
     yearID lgID teamID franchID divID Rank
                                                  G Ghome
                                                           W
                                                              L
                                                                 DivWin WCWin LgWin
## 1
                                              2 162
                                                          77
                                                              85
       2005
               NL
                     ARI
                               ARI
                                        W
                                                       81
                                                                       N
## 2
                                        Ε
                                                          90 72
                                                                       Y
                                                                             N
       2005
               NL
                     ATL
                               ATL
                                              1 162
                                                       81
                                                                                    N
## 3
       2005
               AL
                     BAL
                               BAL
                                        Ε
                                              4
                                               162
                                                       81
                                                          74
                                                              88
                                                                       N
                                                                             N
                                                                                    N
## 4
       2005
               AL
                     BOS
                               BOS
                                        Ε
                                              2 162
                                                       81
                                                          95
                                                              67
                                                                       N
                                                                             Y
                                                                                    N
       2005
                     CHA
                               CHW
                                        C
                                                                       Y
                                                                             N
                                                                                    Y
##
  5
               AL
                                              1 162
                                                       81
                                                          99
                                                              63
                     CHN
                                        С
                                                                       N
                                                                                    N
##
   6
       2005
               NL
                               CHC
                                              4
                                               162
                                                       81
                                                          79
                                                              83
                                                                             N
                                                                                  SHO SV
##
     WSWin
              R
                  AB
                         H X2B X3B
                                    HR
                                         BB
                                              SO
                                                   SB
                                                      CS HBP
                                                              SF
                                                                  RA
                                                                      ER
                                                                           ERA
                                                                               CG
## 1
         N 696 5550 1419
                           291
                                27 191
                                        606 1094
                                                   67
                                                      26
                                                           55
                                                              45
                                                                 856
                                                                     783
                                                                          4.84
                                                                                6
                                                                                    10 45
## 2
                5486 1453
                           308
                                37 184
                                        534
                                            1084
                                                   92
                                                      32
                                                           45
                                                             46
                                                                 674
                                                                     639
                                                                          3.98
                                                                                8
                                                                                    12 38
         N 769
## 3
         N 729
               5551 1492
                           296
                                27 189
                                        447
                                             902
                                                   83
                                                      37
                                                           54
                                                              42
                                                                 800 724
                                                                          4.56
                                                                                2
                                                                                     9
                                                                                       38
## 4
         N 910 5626 1579
                           339
                                21 199 653 1044
                                                   45
                                                      12
                                                           47
                                                              63 805 752 4.74
                                                                                6
                                                                                     8 38
## 5
                                23 200 435 1002 137
                                                                 645 592 3.61
         Y 741 5529 1450
                           253
                                                      67
                                                           79
                                                              49
                                                                                    10 54
##
  6
         N 703 5584 1506
                           323
                                23 194 419
                                             920
                                                   65
                                                      39
                                                          50
                                                             37
                                                                 714 671 4.19
                                                                                    10 39
                                                                                8
##
     IPouts
               HA HRA BBA
                            SOA
                                  Ε
                                      DP
                                            FP
## 1
       4369 1580 193 537
                           1038
                                 94 159 0.985 Arizona Diamondbacks
## 2
       4331 1487 145 520
                            929
                                 86 170 0.986
                                                      Atlanta Braves
## 3
       4283 1458 180 580 1052 107 154 0.982
                                                   Baltimore Orioles
## 4
       4287 1550 164 440
                            959
                                109 135 0.982
                                                      Boston Red Sox
## 5
       4427 1392 167 459 1040
                                 94 166 0.985
                                                   Chicago White Sox
##
  6
       4320 1357 186 576 1256 101 136 0.983
                                                        Chicago Cubs
##
                                                        teamIDBR teamIDlahman45
                              park attendance BPF PPF
## 1
                Bank One Ballpark
                                       2059424 103 105
                                                              ARI
                                                                              ARI
## 2
                     Turner Field
                                       2521167 101 100
                                                              ATL
                                                                              ATL
## 3 Oriole Park at Camden Yards
                                       2624740
                                                 99
                                                     99
                                                              BAL
                                                                              BAL
## 4
                   Fenway Park II
                                       2847888 104 104
                                                              BOS
                                                                              BOS
## 5
              U.S. Cellular Field
                                       2342833 103 103
                                                              CHW
                                                                              CHA
## 6
                    Wrigley Field
                                       3099992 104 104
                                                              CHC
                                                                              CHN
##
     teamIDretro
## 1
              ARI
## 2
              ATL
## 3
              BAL
## 4
              BOS
## 5
              CHA
## 6
              CHN
```

Exploratory data analysis

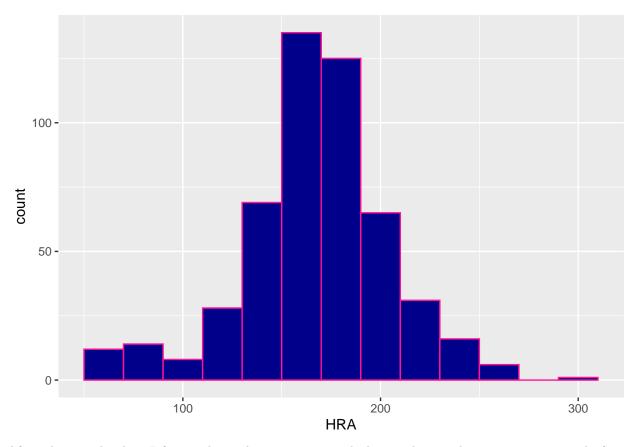
plot of revised data frame histogram of Home runs allowed to see distribution of the data

```
g <- ggplot(data = revisedTeams, aes(x = yearID, y = HRA, color = franchID)) +
    geom_point()

gg <- ggplot(data = revisedTeams, aes(x = HRA)) +
    geom_histogram(binwidth = 20, color = "deeppink", fill = "darkblue")
g</pre>
```



gg



After plotting the data I forgot about the 2020 season which was shortened to 60 games instead of 162 which, gave an unrealistic amount of 0 - 80 home runs allowed so we're going to remove that year.

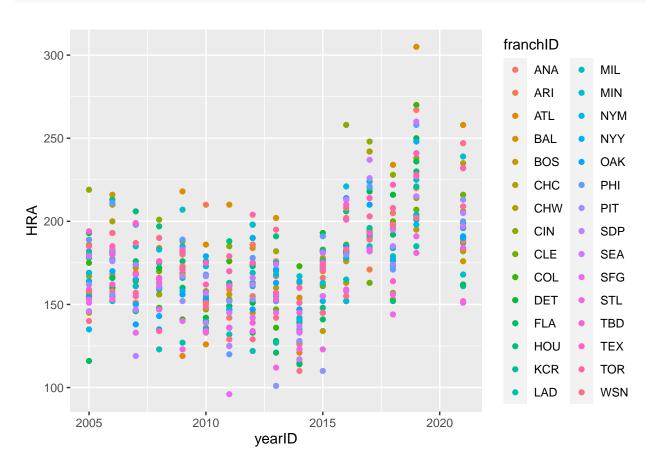
```
RevisedTeams2 <- filter(revisedTeams, yearID != 2020)
head(RevisedTeams2)</pre>
```

```
yearID lgID teamID franchID divID Rank
                                                 G Ghome
                                                             L DivWin WCWin LgWin
##
                                                           W
## 1
       2005
                     ARI
                                             2 162
                                                       81 77 85
                                                                      N
                                                                            N
               NL
                               ARI
                                       W
                                                                                   N
## 2
       2005
               NL
                     ATL
                               ATL
                                       Ε
                                             1 162
                                                       81
                                                         90 72
                                                                      Y
                                                                            N
                                                                                   N
## 3
       2005
                               BAL
                                       Ε
                                             4 162
                                                       81 74 88
                                                                            N
                                                                                   N
               AL
                     BAL
                                                                      N
## 4
       2005
                     BOS
                               BOS
                                       Ε
                                                                      N
                                                                            Y
                                                                                   N
               AL
                                             2 162
                                                       81 95
                                                             67
## 5
       2005
               AL
                     CHA
                               CHW
                                       C
                                             1 162
                                                       81
                                                         99
                                                                      Y
                                                                            N
                                                                                   Y
                                                             63
       2005
                                       С
##
   6
               NL
                     CHN
                               CHC
                                             4 162
                                                       81 79
                                                             83
                                                                      N
                                                                            N
                                                                                   N
##
     WSWin
                  AB
                        н хав хав
                                    HR
                                       BB
                                              SO
                                                  SB CS HBP SF
                                                                 RA
                                                                      ER
                                                                          ERA CG SHO SV
## 1
         N 696 5550 1419 291
                                27 191 606 1094
                                                  67 26
                                                          55
                                                             45 856 783
                                                                         4.84
                                                                                   10 45
## 2
         N 769 5486 1453
                          308
                                                  92
                                                     32
                                                          45 46 674
                                                                    639
                                                                         3.98
                                                                                   12 38
                                37 184 534
                                            1084
                                                                               8
##
  3
         N 729 5551 1492 296
                                27 189 447
                                             902
                                                  83 37
                                                          54 42 800 724 4.56
                                                                               2
                                                                                    9 38
##
         N 910 5626 1579
                          339
                                21 199 653 1044
                                                  45
                                                     12
                                                          47 63 805 752 4.74
                                                                                    8 38
## 5
                                23 200 435
                                           1002 137 67
                                                          79
                                                             49 645 592 3.61
         Y 741 5529 1450
                          253
                                                                               9
                                                                                   10 54
##
   6
         N 703 5584 1506
                          323
                                23 194 419
                                             920
                                                  65
                                                     39
                                                          50
                                                             37
                                                                714 671 4.19
                                                                                   10 39
     IPouts
##
               HA HRA BBA
                           SOA
                                  Ε
                                     DP
                                            FP
                                                                name
## 1
       4369 1580 193 537 1038
                                 94 159 0.985 Arizona Diamondbacks
## 2
       4331 1487 145 520
                           929
                                 86 170 0.986
                                                      Atlanta Braves
## 3
       4283 1458 180 580 1052 107 154 0.982
                                                  Baltimore Orioles
## 4
       4287 1550 164 440
                           959 109 135 0.982
                                                     Boston Red Sox
## 5
       4427 1392 167 459 1040
                                94 166 0.985
                                                  Chicago White Sox
## 6
       4320 1357 186 576 1256 101 136 0.983
                                                        Chicago Cubs
```

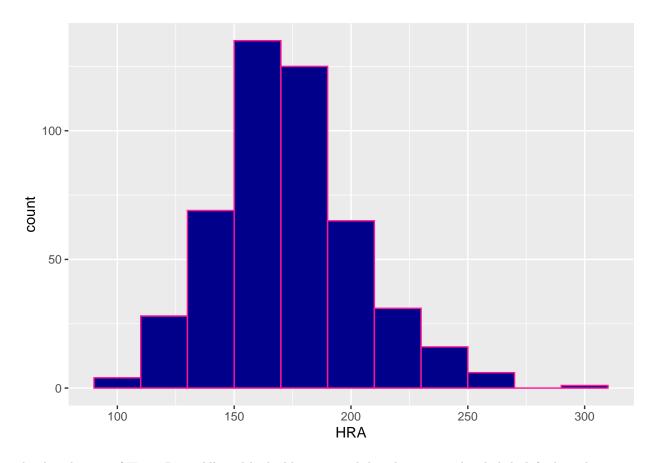
```
park attendance BPF PPF teamIDBR teamIDlahman45
##
## 1
               Bank One Ballpark
                                      2059424 103 105
                                                            ARI
                                                                            ARI
## 2
                     Turner Field
                                                            ATL
                                      2521167 101 100
                                                                            ATL
## 3 Oriole Park at Camden Yards
                                      2624740
                                                            BAL
                                                                            BAL
                                               99
                                                   99
## 4
                   Fenway Park II
                                      2847888 104 104
                                                            BOS
                                                                            BOS
## 5
             U.S. Cellular Field
                                      2342833 103 103
                                                            CHW
                                                                            CHA
## 6
                    Wrigley Field
                                      3099992 104 104
                                                            CHC
                                                                            CHN
##
     teamIDretro
## 1
             ARI
## 2
             ATL
## 3
             BAL
             BOS
## 4
## 5
             CHA
## 6
             CHN
```

revised plots with 2020 removed because of the shortened season

```
g <- ggplot(data = RevisedTeams2, aes(x = yearID, y = HRA, color = franchID)) +
   geom_point()
gg <- ggplot(data = RevisedTeams2, aes(x = HRA)) +
   geom_histogram(binwidth = 20, color = "deeppink", fill = "darkblue")
g</pre>
```



gg



the distribution of Home Runs Allowed looks like a normal distribution maybe slightly left skewed.

Building the model

I'm using the information out of the book and separating the data into two splits. One of the splits is 80% of the data which is our training set which will be used to train the model and the other 20% is only used for testing our model. The method I'll be using to build the model is step wise linear regression.

setting up the test and training sets

```
set.seed(1234)
# training set w/ 80% of total data
train <- RevisedTeams2 %>%
    dplyr::sample_frac(.8)
# test set with remaining 20% of the data
test <- dplyr::anti_join(RevisedTeams2, train)

## Joining with 'by = join_by(yearID, lgID, teamID, franchID, divID, Rank, G,
## Ghome, W, L, DivWin, WCWin, LgWin, WSWin, R, AB, H, X2B, X3B, HR, BB, SO, SB,
## CS, HBP, SF, RA, ER, ERA, CG, SHO, SV, IPouts, HA, HRA, BBA, SOA, E, DP, FP,
## name, park, attendance, BPF, PPF, teamIDBR, teamIDlahman45, teamIDretro)'

# checking to make sure everything is good
nrow(RevisedTeams2)</pre>
```

```
## [1] 480

nrow(train)

## [1] 384

nrow(test)

## [1] 96

# the number of rows of test and train add up to the number of rows in
# RevisedTeams2 so we are good.
```

Choosing Independent Variables Our dependent variable is home runs against (HRA) but, what independent variables affect our dependent variable?

When looking at the data set any stats that deal with pitching have some sort of relevance to home runs against since you can only give up home runs when your team is on defense. For my independent variables I'm choosing pretty much all of the pitching variables because they could all have an effect on home runs against. I'm choosing Wins(W), Losses(L), Runs Against(RA), Earned Runs (ER), Earned Run Average (ERA), Complete Games(CG), Shut Outs (SHO), Saves(SV), Outs Pitched (IPouts), Hits against (HA), Walks Against (BBA), and finally Strike Outs Against (SOA).

```
##
## Call:
  lm(formula = HRA ~ W + L + RA + ER + ERA + CG + SHO + SV + IPouts +
##
       HA + BBA + SOA, data = train)
##
## Residuals:
##
       Min
                1Q
                    Median
                                 3Q
                                         Max
  -48.070 -11.823
                    -0.325
                            11.942 53.568
##
## Coefficients:
##
                 Estimate Std. Error t value Pr(>|t|)
## (Intercept) 107.919753 740.691727
                                         0.146
                                                 0.8842
## W
                  1.957218
                             3.128842
                                         0.626
                                                 0.5320
## L
                  1.830428
                             3.134300
                                         0.584
                                                 0.5596
                 0.078679
                             0.073532
                                                 0.2853
## RA
                                         1.070
## ER
                 0.887815
                             0.854107
                                         1.039
                                                 0.2993
## ERA
               -69.310871 136.132108
                                        -0.509
                                                 0.6110
## CG
                 0.322205
                             0.355674
                                         0.906
                                                 0.3656
                                       -2.570
## SHO
                -0.770897
                             0.300017
                                                 0.0106 *
## SV
                 0.251014
                             0.167728
                                                 0.1354
                                         1.497
## IPouts
                -0.071149
                             0.133254
                                       -0.534
                                                 0.5937
## HA
                -0.194038
                             0.023821
                                        -8.146 5.82e-15 ***
## BBA
                -0.170521
                             0.019913
                                       -8.563 2.96e-16 ***
## SOA
                 0.052261
                             0.008656
                                         6.038 3.79e-09 ***
## ---
```

```
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 16.86 on 371 degrees of freedom
## Multiple R-squared: 0.7124, Adjusted R-squared: 0.7031
## F-statistic: 76.59 on 12 and 371 DF, p-value: < 2.2e-16</pre>
```

now I'll perform step wise regression to improve the model (get all variables 0.05 p values and lower) I got rid of ERA because it was the least significant independent variable

```
fit1 <- lm(HRA \sim W + L + RA + ER + CG + SHO + SV + IPouts + HA + BBA + SOA,
          data = train)
summary(fit1)
##
## Call:
## lm(formula = HRA ~ W + L + RA + ER + CG + SHO + SV + IPouts +
      HA + BBA + SOA, data = train)
## Residuals:
##
                1Q Median
                                3Q
       Min
                                       Max
## -47.937 -12.016 -0.325 11.812 53.583
##
## Coefficients:
                 Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.731e+02 4.935e+02
                                     -0.351 0.72594
## W
                1.913e+00
                           3.125e+00
                                       0.612
                                              0.54081
## L
                1.779e+00 3.130e+00
                                       0.568 0.57006
## RA
                7.987e-02 7.342e-02
                                       1.088 0.27738
## ER
                4.546e-01
                          7.475e-02
                                       6.082 2.95e-09 ***
## CG
                3.332e-01
                          3.547e-01
                                       0.939
                                              0.34810
## SHO
               -7.817e-01
                          2.990e-01
                                     -2.615
                                              0.00929 **
## SV
               2.500e-01
                          1.675e-01
                                             0.13651
                                       1.492
## IPouts
               -4.549e-03
                           2.539e-02
                                      -0.179
                                              0.85792
## HA
               -1.940e-01 2.380e-02
                                     -8.151 5.56e-15 ***
## BBA
               -1.707e-01 1.989e-02
                                      -8.580 2.60e-16 ***
## SOA
               5.236e-02 8.645e-03
                                       6.057 3.39e-09 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## Residual standard error: 16.85 on 372 degrees of freedom
## Multiple R-squared: 0.7122, Adjusted R-squared: 0.7037
```

now I'm just going to continue getting rid of independent variables until all of the independent variables have a p-value of 0.05 or less. Next up to get rid of is IPouts.

F-statistic: 83.69 on 11 and 372 DF, p-value: < 2.2e-16

```
##
## Call:
```

```
## lm(formula = HRA \sim W + L + RA + ER + CG + SHO + SV + HA + BBA +
##
      SOA, data = train)
##
## Residuals:
      Min
               1Q Median
                               3Q
                                      Max
## -48.173 -12.005 -0.353 11.859 53.460
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.728e+02 4.928e+02 -0.351 0.72599
               1.797e+00 3.053e+00
                                      0.589 0.55649
## L
               1.667e+00 3.062e+00
                                      0.544 0.58657
## R.A
               8.166e-02 7.265e-02
                                      1.124 0.26171
## ER
               4.549e-01 7.464e-02
                                      6.095 2.73e-09 ***
## CG
                                      0.944 0.34576
               3.343e-01 3.541e-01
## SHO
              -7.808e-01
                         2.985e-01
                                     -2.615 0.00927 **
## SV
               2.488e-01 1.672e-01
                                      1.488 0.13758
## HA
              -1.955e-01 2.215e-02
                                     -8.828 < 2e-16 ***
              -1.713e-01 1.960e-02 -8.737 < 2e-16 ***
## BBA
## SOA
               5.199e-02 8.376e-03
                                      6.207 1.44e-09 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 16.83 on 373 degrees of freedom
## Multiple R-squared: 0.7122, Adjusted R-squared: 0.7045
## F-statistic: 92.3 on 10 and 373 DF, p-value: < 2.2e-16
Getting rid of L
fit3 <- lm(HRA ~ W + RA + ER + CG + SHO + SV + HA + BBA + SOA,
         data = train)
summary(fit3)
##
## Call:
## lm(formula = HRA ~ W + RA + ER + CG + SHO + SV + HA + BBA + SOA,
##
      data = train)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -48.144 -12.043 -0.321 11.954 53.473
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 94.698900 35.263235
                                    2.685 0.00757 **
## W
                                     1.166 0.24436
               0.136487
                          0.117057
## RA
               0.082006
                          0.072574
                                    1.130 0.25921
## ER
               0.453903
                          0.074544
                                     6.089 2.82e-09 ***
## CG
               0.319821
                          0.352810
                                    0.906 0.36526
## SHO
              -0.774307
                          0.298018 -2.598 0.00974 **
## SV
                                    1.490 0.13714
               0.248842
                          0.167038
## HA
              -0.193962
                          0.021942 -8.840 < 2e-16 ***
## BBA
              -0.171622
                          0.019570 -8.770 < 2e-16 ***
```

```
0.052225
                          0.008357
                                     6.249 1.12e-09 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 16.81 on 374 degrees of freedom
## Multiple R-squared: 0.712, Adjusted R-squared: 0.705
## F-statistic: 102.7 on 9 and 374 DF, p-value: < 2.2e-16
getting rid of CG
fit4 <- lm(HRA ~ W + RA + ER + SHO + SV + HA + BBA + SOA,
          data = train)
summary(fit4)
##
## Call:
## lm(formula = HRA ~ W + RA + ER + SHO + SV + HA + BBA + SOA, data = train)
## Residuals:
      Min
                1Q Median
                               3Q
                                      Max
## -48.926 -12.290
                    0.014 12.050 53.924
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 102.124232 34.290521
                                      2.978 0.00309 **
                0.152779
                           0.115641
                                      1.321 0.18726
                           0.072472
## RA
                0.078825
                                      1.088 0.27744
                           0.074523
## ER
                0.454527
                                      6.099 2.66e-09 ***
## SHO
               -0.720077
                           0.291882 -2.467 0.01407 *
## SV
                0.208238
                           0.160882
                                      1.294 0.19634
## HA
               -0.193715
                           0.021935 -8.831 < 2e-16 ***
## BBA
               -0.174278
                           0.019344 -9.009 < 2e-16 ***
                                      6.383 5.14e-10 ***
## SOA
                0.049357
                           0.007733
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 16.81 on 375 degrees of freedom
## Multiple R-squared: 0.7113, Adjusted R-squared: 0.7052
## F-statistic: 115.5 on 8 and 375 DF, p-value: < 2.2e-16
getting rid of RA
fit4 <- lm(HRA ~ W + ER + SHO + SV + HA + BBA + SOA,
         data = train)
summary(fit4)
##
## Call:
## lm(formula = HRA ~ W + ER + SHO + SV + HA + BBA + SOA, data = train)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
```

```
## -48.023 -12.003 0.194 11.853 54.077
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 102.839118 34.292564
                                      2.999 0.00289 **
                0.138640
                                      1.206 0.22849
## W
                           0.114936
## ER
                           0.026801 19.781 < 2e-16 ***
                0.530162
## SHO
               -0.754687
                           0.290213 -2.600 0.00968 **
## SV
                0.193174
                           0.160324
                                     1.205 0.22900
## HA
               -0.189525
                           0.021599 -8.775 < 2e-16 ***
## BBA
               -0.171944
                           0.019230 -8.942 < 2e-16 ***
## SOA
                0.050077
                           0.007707
                                     6.498 2.59e-10 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 16.81 on 376 degrees of freedom
## Multiple R-squared: 0.7104, Adjusted R-squared: 0.705
## F-statistic: 131.8 on 7 and 376 DF, p-value: < 2.2e-16
getting rid of SV
fit5 <- lm(HRA ~ W + ER + SHO + HA + BBA + SOA,
         data = train)
summary(fit5)
##
## Call:
## lm(formula = HRA ~ W + ER + SHO + HA + BBA + SOA, data = train)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -48.438 -12.461
                   0.127 11.362 53.378
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 105.096349 34.261866
                                     3.067 0.00231 **
## W
                0.201025
                           0.102675
                                      1.958 0.05098 .
## ER
                           0.026013 20.079 < 2e-16 ***
                0.522314
## SHO
               -0.771140
                           0.290065 -2.659 0.00818 **
               -0.186075
                           0.021421 -8.686 < 2e-16 ***
## HA
## BBA
               -0.170383
                           0.019197
                                    -8.875 < 2e-16 ***
                           0.007709
## SOA
                0.050316
                                     6.527 2.17e-10 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 16.82 on 377 degrees of freedom
## Multiple R-squared: 0.7093, Adjusted R-squared: 0.7047
## F-statistic: 153.3 on 6 and 377 DF, p-value: < 2.2e-16
getting rid of W
```

```
##
## Call:
## lm(formula = HRA ~ ER + SHO + HA + BBA + SOA, data = train)
##
## Residuals:
                                3Q
##
       Min
                1Q
                    Median
                                       Max
   -50.893 -12.171
##
                     0.116
                            11.664
                                    54.090
##
## Coefficients:
##
                 Estimate Std. Error t value Pr(>|t|)
  (Intercept) 129.016503 32.129297
                                       4.016 7.16e-05 ***
##
## ER
                 0.508302
                            0.025103
                                      20.249
                                              < 2e-16 ***
## SHO
                -0.705283
                            0.289186
                                      -2.439
                                               0.0152 *
## HA
                -0.185783
                            0.021501
                                      -8.641
                                              < 2e-16 ***
## BBA
                -0.174209
                            0.019169
                                      -9.088
                                              < 2e-16 ***
## SOA
                 0.052541
                            0.007653
                                       6.866 2.73e-11 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 16.88 on 378 degrees of freedom
## Multiple R-squared: 0.7063, Adjusted R-squared: 0.7025
## F-statistic: 181.8 on 5 and 378 DF, p-value: < 2.2e-16
```

Since fit6 has only independent variables with a p-value of 0.05 or lower it is the final fit.

Interpretation The point estimate tells us that when all of the independent = 0 the expected result would be 126 +- 32 (Std. Error).

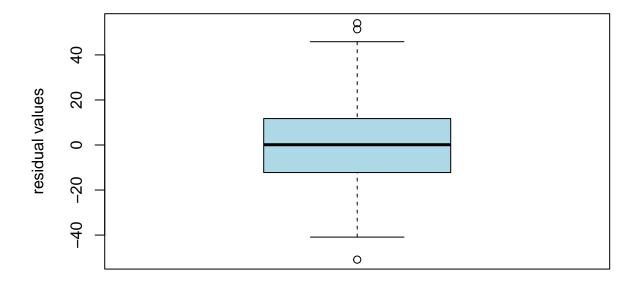
The t-value is 4 and this is how many standard errors our coefficient is from 0. The t-value of 4 tells us that the independent variables are strong predictors of HRA.

The Residual Standard error is 16.88 and this is the standard deviation of the residuals and tells us that our data points are going to be more spread out around the regression line.

The R-squared value tells us how well independent variables fit our dependent variables the closer to 1 the better and the closer to 0 is bad. The value of 0.7025 is good enough and tells us that about 70% of our outputs can be explained and 30% can't be.

residuals graph residuals tell us how far away our predictions are from the actual value. The more normally distributed the residuals are the better our model predicts because the closer to the 0 the more accurate our predictions will be.

```
res <- resid(fit6)
boxplot(res, col = "lightblue", ylab = "residual values")</pre>
```

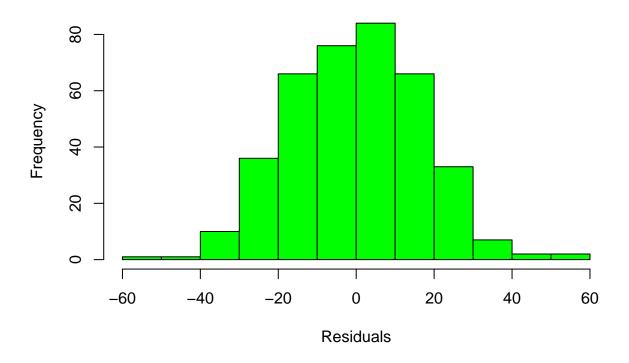


plot(fitted(fit6), res, col = "deeppink", xlab = "Home Runs Agianst (HRA)", ylab = "residuals")
abline(0,0)



hist(res, col = "green", xlab = "Residuals", main = "Histogram of Residuals")

Histogram of Residuals



The box plot shows us that our model is a good fit for our data because the median seems to be about 0 and Q1 and Q3 look to be the same length our residuals seem to be normally distributed. This is further backed up when looking at the histogram because our data looks normally distributed.

Data Visualization

Applying Predictive model with the test set

```
predictions <- predict(fit6, test)
head(predictions)

## 1 2 3 4 5 6
## 187.4136 138.9486 201.7415 147.7924 185.9703 146.9373

predictDF <- data.frame(test, predictions)
RevisedTeams2DF <- select(predictDF, "yearID", "franchID", "HRA", "predictions")
RevisedTeams2DF$roundedPredictions <- round(RevisedTeams2DF$predictions, 0)
RevisedTeams2DF$TF <- RevisedTeams2DF$HRA == RevisedTeams2DF$roundedPredictions
head(RevisedTeams2DF)</pre>
```

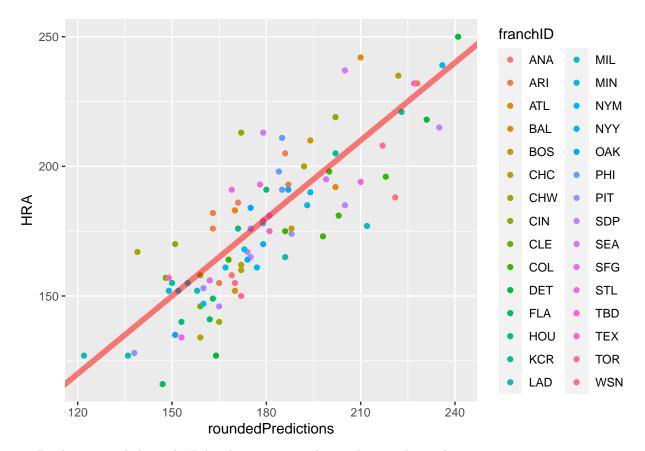
```
##
     yearID franchID HRA predictions roundedPredictions
## 1
       2005
                  ARI 193
                             187.4136
                                                       187 FALSE
## 2
       2005
                  CHW 167
                             138.9486
                                                       139 FALSE
## 3
       2005
                 CIN 219
                             201.7415
                                                       202 FALSE
```

```
## 4 2005 CLE 157 147.7924 148 FALSE
## 5 2005 COL 175 185.9703 186 FALSE
## 6 2005 FLA 116 146.9373 147 FALSE
```

I rounded the predictions to the nearest whole number because you can't have fractions of home runs given up.

Graph of Predictions vs Actual Values Using Test Set

```
g <- ggplot(data = RevisedTeams2DF, aes(x = roundedPredictions, y = HRA, col = franchID)) +
   geom_point() + geom_abline(intercept = 0, slope = 1, color = "red",alpha = 0.5, linewidth = 2)
g</pre>
```



our Predictions and the real HRA values appear to have a linear relationship.

Results

```
results <- RevisedTeams2DF %>%
  group_by(TF) %>%
  summarize(count = n())
results
```

```
## # A tibble: 2 x 2
## TF count
## <lgl> <int>
## 1 FALSE 92
## 2 TRUE 4
```

4

5

6

1

ARI 191

The model accurately predicted 4/96 of the number of home runs against a team had which is only a little over 4% accurate which isn't really that great but good enough to use on 2022 stats to have an idea of how many home runs a team will give up in 2022.

Predicting 2022 HRA using 2022 stats from Baseball Reference

importing the csv file and cleaning the data set

```
# making 2022 dataset manually from Baseball Reference website
# importing csv file
Teams2022 <- read.csv("2022 Team Pitching stats MLB.csv", header = T)
# cleaning the data set
Teams_2022 \leftarrow Teams_2022[-(31:32),]
franchID <- c("ARI", "ATL", "BAL", "BOS", "CHC", "CHW", "CIN", "CLE", "COL", "DET", "HOU", "KCR", "ANA",
Teams__2022 <- data.frame(franchID, Teams_2022)</pre>
Teams___2022 <- select(Teams__2022, franchID, HR, ER, tSho, H, BB, SO)
Teams2022Rename <- Teams___2022 %>%
  rename(HRA = HR, ER = ER, SHO = tSho, HA = H, BBA = BB, SOA = SO)
head (Teams 2022 Rename)
##
     franchID HRA ER SHO
                             HA BBA SOA
## 1
          ARI 191 676 10 1345 504 1216
## 2
          ATL 148 556
                        9 1224 500 1554
## 3
          BAL 171 632 15 1406 443 1214
```

Predicting predicting 2022 home run against for each team

191.7856

BOS 185 721 10 1411 526 1346

CHC 207 642 11 1342 540 1383

CHW 166 631 14 1330 533 1450

```
predictions2 <- predict(fit6, Teams2022Rename)
head(predictions2)

## 1 2 3 4 5 6
## 191.7856 172.4302 165.0828 205.3953 176.8583 176.1202

predictDF2022 <- data.frame(Teams2022Rename, predictions2)
RevisedTeams2DF2022 <- select(predictDF2022, "franchID", "HRA", "predictions2")
RevisedTeams2DF2022$roundedPredictions2 <- round(RevisedTeams2DF2022$predictions2, 0)
RevisedTeams2DF2022$TF <- RevisedTeams2DF2022$HRA == RevisedTeams2DF2022$roundedPredictions2
print(RevisedTeams2DF2022)</pre>
## franchID HRA predictions2 roundedPredictions2 TF
```

192 FALSE

```
## 2
           ATL 148
                        172.4302
                                                  172 FALSE
                        165.0828
## 3
           BAL 171
                                                  165 FALSE
                        205.3953
## 4
           BOS 185
                                                  205 FALSE
## 5
           CHC 207
                        176.8583
                                                  177 FALSE
## 6
           CHW 166
                        176.1202
                                                  176 FALSE
## 7
           CIN 213
                        229.0576
                                                  229 FALSE
## 8
           CLE 172
                        172.6736
                                                  173 FALSE
           COL 184
                                                  219 FALSE
## 9
                        219.2628
## 10
           DET 167
                        172.7216
                                                  173 FALSE
## 11
           HOU 134
                        144.7034
                                                  145 FALSE
## 12
           KCR 173
                        181.4050
                                                  181 FALSE
## 13
           ANA 168
                        170.5503
                                                  171 FALSE
## 14
           LAD 152
                        146.7883
                                                  147 FALSE
## 15
           FLA 173
                        178.5046
                                                  179 FALSE
## 16
           MIL 190
                        193.4891
                                                  193 FALSE
## 17
           MIN 184
                        183.7376
                                                  184 TRUE
## 18
           NYM 169
                                                  176 FALSE
                        176.3255
## 19
           NYY 157
                        168.7901
                                                  169 FALSE
           OAK 195
## 20
                                                  205 FALSE
                        205.1297
## 21
           PHI 150
                        185.6827
                                                  186 FALSE
## 22
           PIT 164
                        195.9347
                                                  196 FALSE
## 23
           SDP 173
                        189.0725
                                                  189 FALSE
## 24
           SEA 186
                                                  173 FALSE
                        173.2216
## 25
           SFG 132
                        170.5790
                                                  171 FALSE
## 26
           STL 146
                        153.1811
                                                  153 FALSE
## 27
           TBD 172
                        170.2134
                                                  170 FALSE
## 28
           TEX 169
                        181.9956
                                                  182 FALSE
           TOR 180
                        184.3560
                                                  184 FALSE
## 29
## 30
           WSN 244
                        219.1880
                                                  219 FALSE
```

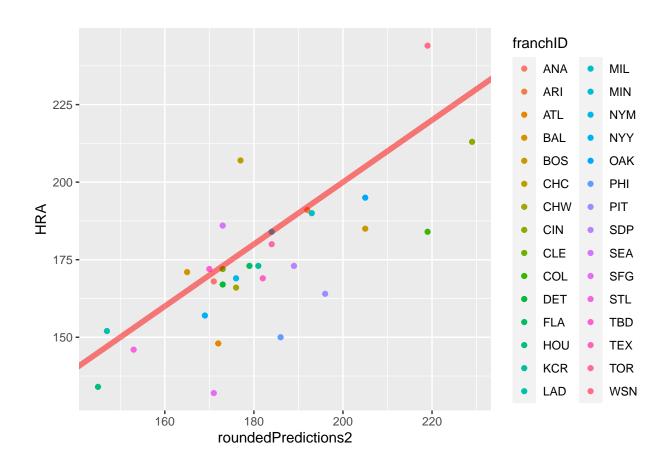
Results for 2022

```
results2022 <- RevisedTeams2DF2022 %>%
  group_by(TF) %>%
  summarize(count = n())
results2022
```

```
## # A tibble: 2 x 2
## TF count
## <| clip < clip <
```

predictions vs actual values for 2022

```
g <- ggplot(data = RevisedTeams2DF2022, aes(x = roundedPredictions2, y = HRA, col = franchID)) +
   geom_point() + geom_abline(intercept = 0, slope = 1, color = "red",alpha = 0.5, linewidth = 2)
g</pre>
```



df <- RevisedTeams2DF2022[c(1,3,6,7,8,10,11,12,13,14,15,16,17,18,19,20,23,24,26,27,28,29),] df

##		${\tt franchID}$	${\tt HRA}$	predictions2	${\tt roundedPredictions2}$	TF
##	1	ARI	191	191.7856	192	FALSE
##	3	BAL	171	165.0828	165	FALSE
##	6	CHW	166	176.1202	176	FALSE
##	7	CIN	213	229.0576	229	FALSE
##	8	CLE	172	172.6736	173	FALSE
##	10	DET	167	172.7216	173	FALSE
##	11	HOU	134	144.7034	145	FALSE
##	12	KCR	173	181.4050	181	FALSE
##	13	ANA	168	170.5503	171	FALSE
##	14	LAD	152	146.7883	147	FALSE
##	15	FLA	173	178.5046	179	FALSE
##	16	MIL	190	193.4891	193	FALSE
##	17	MIN	184	183.7376	184	TRUE
##	18	NYM	169	176.3255	176	FALSE
##	19	NYY	157	168.7901	169	FALSE
##	20	OAK	195	205.1297	205	FALSE
##	23	SDP	173	189.0725	189	FALSE
##	24	SEA	186	173.2216	173	FALSE
##	26	STL	146	153.1811	153	FALSE
##	27	TBD	172	170.2134	170	FALSE
##	28	TEX	169	181.9956	182	FALSE
##	29	TOR	180	184.3560	184	FALSE

The table shows all of the predictions that were within 20 home runs against as the real value which was 22 out of the 30 teams. I think that this is pretty good and shows that the regression model does a decent job of giving us an idea of how many home runs a team will give up in a given year.

Conclusion

In conclusion I was able to answer my question from the beginning of seeing if I could accurately predict how many home runs each team will give up in 2022. My predictions weren't as accurate as I would've liked but, I know what to do next time in order to get a more accurate predictive model. I think that to make this model better I would've fed it more information from the beginning instead of limiting the years to only 2005-2021. I think that if I would've given a year range from 1985 - 2021 my model would've been better because it would've had more information to go off of. Overall, I think that my predictions for home runs against in 2022 for each team give a solid idea of the real value is.

References

https://www.baseball-reference.com/leagues/majors/2022.shtml#all_teams_standard_pitching