deliverable2

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Dataset

##

<chr> <chr>

<chr>

My second dataset was compiled from the official NBA website, and it includes more than just home and away final scores. It includes each individual team's box scores stats for every game of the 2018-2019 season. It is 2460 rows, and each row is not the box stats from one single game. To clarify one single game separates each team's box stats into individual rows. For example, April 10, 2019 the Warriors (GSW) played against the Grizzlies (MEM); the first row is the Grizzlies stat line, and the second row is the Warriors stat line. Both of these rows are stats from the same game just separated by team. From my first dataset I want to take the attendance column and use those values for a prediction model.

```
#url <- c("https://www.nba.com/stats/teams/boxscores/?Season=2018-19&SeasonType=Reqular%20Season")
#NBA_box_stats <- read_html(url) %>% html_nodes("main") %>%
# html_nodes("[class = 'nba-stat-table']") %>% #html_text()
#Renaming some columns that have unwanted symbols
NBA_box_stats <- as_tibble(read_csv("2018-19_detailed_box - Sheet1.csv"))
## Parsed with column specification:
## cols(
     .default = col_double(),
##
##
     Team = col_character(),
     'Match Up' = col_character(),
##
     'Game Date' = col_character(),
##
     'W/L' = col_character()
##
## )
## See spec(...) for full column specifications.
NBA_box_stats <- NBA_box_stats %>% rename("PLUS/MINUS" = "#ERROR!")
NBA_box_stats <- NBA_box_stats %>% rename("THREE_PTM" = "3:00 PM")
NBA box stats <- NBA box stats %>% rename("THREE PTA" = "3PA")
NBA_box_stats <- NBA_box_stats %>% rename("THREE_PTPERCENT" = "3P%")
NBA_box_stats <- NBA_box_stats %>% rename("FG_PERCENT" = "FG%")
NBA_box_stats <- NBA_box_stats %>% rename("FT_PERCENT" = "FT%")
NBA_box_stats <- NBA_box_stats %>% rename("W_or_L" = "W/L")
NBA_box_stats
## # A tibble: 2,460 x 24
      Team 'Match Up' 'Game Date' W_or_L
                                            MIN
                                                  PTS
                                                         FGM
                                                               FGA FG PERCENT
```

<chr> <dbl> <dbl> <dbl> <dbl> <dbl>

<dbl>

```
1 MEM
            MEM vs. G~ 04/10/2019 W
                                             240
                                                    132
                                                           48
                                                                 98
                                                                           49
##
    2 GSW
            GSW @ MEM 04/10/2019 L
                                             240
                                                                           50
                                                    117
                                                           46
                                                                 92
            CHA vs. 0~ 04/10/2019 L
##
    3 CHA
                                             240
                                                    114
                                                                 78
                                                                           52.6
   4 ORL
            ORL @ CHA 04/10/2019
##
                                             240
                                                    122
                                                                           54.5
                                    W
                                                           48
                                                                 88
##
    5 MIN
            MIN @ DEN 04/10/2019
                                    L
                                             240
                                                    95
                                                           39
                                                                 91
                                                                           42.9
##
   6 DEN
            DEN vs. M~ 04/10/2019
                                                    99
                                                                           44.8
                                    W
                                             240
                                                           39
                                                                 87
            MIL vs. 0~ 04/10/2019
    7 MIL
                                             240
                                                    116
                                                           43
                                                                100
                                                                           43
            OKC @ MIL 04/10/2019
##
    8 OKC
                                    W
                                             240
                                                    127
                                                           48
                                                                 99
                                                                           48.5
##
    9 IND
            IND @ ATL 04/10/2019
                                    W
                                             240
                                                    135
                                                           45
                                                                 98
                                                                           45.9
## 10 ATL
            ATL vs. I~ 04/10/2019 L
                                             240
                                                    134
                                                           43
                                                                103
                                                                           41.7
    ... with 2,450 more rows, and 15 more variables: THREE_PTM <dbl>,
       THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
       FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
## #
       BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>
```

summary(NBA_box_stats)

```
Match Up
                                                                 W_or_L
##
        Team
                                           Game Date
                       Length:2460
   Length:2460
                                          Length:2460
                                                              Length: 2460
##
   Class :character
                       Class :character
                                          Class : character
                                                              Class : character
   Mode :character
                       Mode :character
                                          Mode :character
                                                              Mode : character
##
##
##
                         PTS
                                          FGM
                                                          FGA
##
         MIN
##
   Min.
           :240.0
                    Min.
                          : 68.0
                                    Min.
                                            :25.00
                                                     Min.
                                                            : 64.00
    1st Qu.:240.0
                    1st Qu.:103.0
                                     1st Qu.:38.00
                                                     1st Qu.: 85.00
##
   Median :240.0
                    Median :111.0
                                    Median :41.00
                                                     Median: 89.00
##
   Mean
           :241.6
                    Mean :111.2
                                    Mean
                                          :41.08
                                                     Mean : 89.21
    3rd Qu.:240.0
                    3rd Qu.:120.0
                                     3rd Qu.:44.00
                                                     3rd Qu.: 94.00
##
   Max.
           :340.0
                           :168.0
                                           :61.00
                                                           :123.00
                    Max.
                                    Max.
                                                     Max.
##
      FG PERCENT
                      THREE PTM
                                      THREE PTA
                                                     THREE PTPERCENT
##
   Min.
           :27.80
                    Min. : 2.00
                                           :12.00
                                                     Min.
                                                           :11.50
                                    Min.
   1st Qu.:42.60
                    1st Qu.: 9.00
                                     1st Qu.:27.00
                                                     1st Qu.:29.60
   Median :46.00
##
                    Median :11.00
                                    Median :32.00
                                                     Median :35.30
##
   Mean :46.14
                    Mean :11.36
                                    Mean :32.01
                                                     Mean :35.52
##
    3rd Qu.:49.50
                    3rd Qu.:14.00
                                     3rd Qu.:37.00
                                                     3rd Qu.:40.92
   Max.
         :64.90
                    Max. :27.00
                                    Max.
                                           :70.00
                                                     Max. :84.20
##
        FTM
                         FTA
                                      FT PERCENT
                                                           OREB
##
   Min.
          : 2.00
                           : 4.00
                                    Min. : 26.30
                                                      Min.
                                                             : 1.00
                    Min.
##
   1st Qu.:13.00
                    1st Qu.:18.00
                                     1st Qu.: 70.00
                                                      1st Qu.: 8.00
   Median :17.00
                    Median :23.00
                                    Median : 77.10
                                                      Median :10.00
                                    Mean : 76.71
##
   Mean :17.68
                    Mean
                           :23.07
                                                      Mean :10.35
##
   3rd Qu.:22.00
                    3rd Qu.:28.00
                                     3rd Qu.: 84.00
                                                      3rd Qu.:13.00
##
   Max.
           :44.00
                    Max.
                           :54.00
                                    Max.
                                           :100.00
                                                      Max.
                                                            :26.00
##
        DREB
                         REB
                                         AST
                                                          STL
##
   Min.
           :18.00
                           :22.00
                                    Min.
                                           :10.00
                                                            : 0.000
                    Min.
                                                     Min.
##
   1st Qu.:31.00
                    1st Qu.:41.00
                                     1st Qu.:21.00
                                                     1st Qu.: 6.000
   Median :35.00
                    Median :45.00
                                    Median :24.00
                                                     Median : 7.000
                                          :24.59
##
   Mean
           :34.82
                    Mean
                           :45.17
                                    Mean
                                                     Mean : 7.634
##
   3rd Qu.:38.00
                    3rd Qu.:50.00
                                    3rd Qu.:28.00
                                                     3rd Qu.: 9.000
           :55.00
                                           :42.00
##
   Max.
                    Max.
                           :71.00
                                    Max.
                                                     Max.
                                                            :20.000
##
        BLK
                          TOV
                                           PF
                                                       PLUS/MINUS
   Min.
          : 0.000
                     Min.
                            : 3.00
                                            : 9.0
                                                     Min.
                                                            :-56
                                     \mathtt{Min}.
```

```
1st Qu.: 3.000
                      1st Qu.:11.00
                                        1st Qu.:18.0
                                                        1st Qu.: -9
##
    Median : 5.000
                      Median :14.00
##
                                        Median:21.0
                                                        Median:
    Mean
            : 4.953
                      Mean
                              :14.08
                                        Mean
                                                :20.9
                                                        Mean
    3rd Qu.: 6.000
                      3rd Qu.:17.00
                                        3rd Qu.:24.0
                                                                   9
##
                                                        3rd Qu.:
##
    Max.
            :19.000
                      Max.
                              :29.00
                                        Max.
                                                :38.0
                                                        Max.
                                                                  56
```

It is really interesting looking at the summary of this table. From the summary I can really get a sense of how much basketball is sport with a lot of high and lot of low points. For example, in the summary of the 3 point field goal attempts the max value is 70 and the minimum value is 12. I looked through my data and found the Houston Rockets were responsible for the 70 attempts, and the Los Angeles Clippers had the lowest 3 point attempts. I also found that Houston was responsible for the top three most 3 pointers attempted that season. Almost every column features a large gap between the min and max values. Another example is the point totals. The minimum points was 68 and the max was 168. The max points came from a quadruple overtime game between the Chicago Bulls and Atlanta Hawks, so this max point value is definitely an outlier data point.

Model Planning and Building

Before I try to incorporate home court vs away factors, I want to do a general points prediction of all teams without home or away factors. I am using rebounds and assists as the variables for predicting points scored. Generally in basketball getting more rebounds means that a team is able to posses the ball more teams which leads to more opportunities to score, so based on that thought rebounds should be a solid variable to use in my model. In basketball an assist is counted when there is a pass made that directly leads to a basket getting scored, so numerically the more assists a team has than the more points they have. Also getting more assists in a game usually indicates that a team is executing their sets very well and also working really well as a team, as a result these un-trackable factors usually lead to more points being scored.

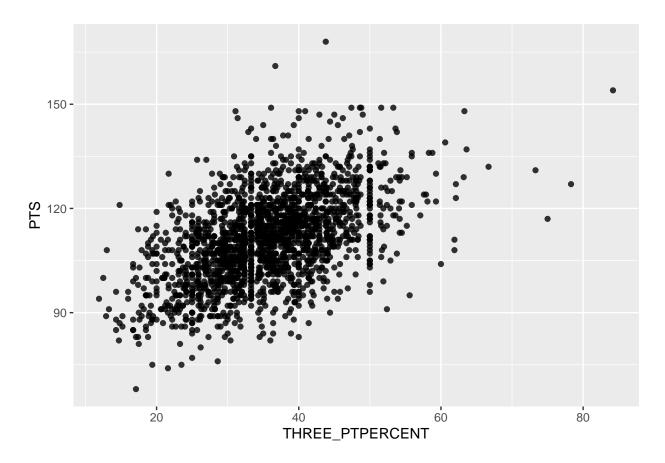
```
#Partitioning my test set for my model
#Data split 60 training 20 validation and 20 for testing
leftover_rows <- as.vector(createDataPartition(NBA_box_stats$PTS, p = 0.8, list = FALSE))
test_set <- NBA_box_stats[-leftover_rows, ]
leftover <- NBA_box_stats[leftover_rows, ]
leftover</pre>
```

```
# A tibble: 1,969 x 24
##
                         'Game Date' W_or_L
##
      Team
             'Match Up'
                                               MIN
                                                      PTS
                                                             FGM
                                                                   FGA FG_PERCENT
##
                                                          <dbl>
      <chr>
            <chr>
                         <chr>>
                                      <chr>
                                             <dbl>
                                                    <dbl>
                                                                 <dbl>
                                                                             <dbl>
             MEM vs. G~ 04/10/2019
##
    1 MEM
                                      W
                                               240
                                                      132
                                                              48
                                                                    98
                                                                              49
##
    2 CHA
             CHA vs. 0~ 04/10/2019
                                     L
                                               240
                                                      114
                                                              41
                                                                    78
                                                                              52.6
##
    3 MIN
             MIN @ DEN
                         04/10/2019
                                     L
                                               240
                                                       95
                                                              39
                                                                    91
                                                                              42.9
    4 DEN
                                                              39
##
             DEN vs. M~ 04/10/2019
                                      W
                                               240
                                                       99
                                                                    87
                                                                              44.8
                                                                              48.5
    5 OKC
             OKC @ MIL
                         04/10/2019
                                                                    99
##
                                      W
                                               240
                                                      127
                                                              48
##
    6 IND
             IND @ ATL
                         04/10/2019
                                      W
                                               240
                                                      135
                                                              45
                                                                    98
                                                                              45.9
      POR
##
    7
             POR vs. S~ 04/10/2019
                                     W
                                               240
                                                      136
                                                              53
                                                                    91
                                                                              58.2
##
    8 UTA
             UTA @ LAC
                        04/10/2019
                                               265
                                                      137
                                                              47
                                                                   106
                                                                              44.3
##
    9 BKN
             BKN vs. M~ 04/10/2019
                                      W
                                               240
                                                      113
                                                              43
                                                                   114
                                                                              37.7
             DET @ NYK
                        04/10/2019
                                      W
                                               240
                                                      115
                                                              41
                                                                    85
                                                                              48.2
     ... with 1,959 more rows, and 15 more variables: THREE_PTM <dbl>,
##
       THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
## #
       FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
## #
       BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>
```

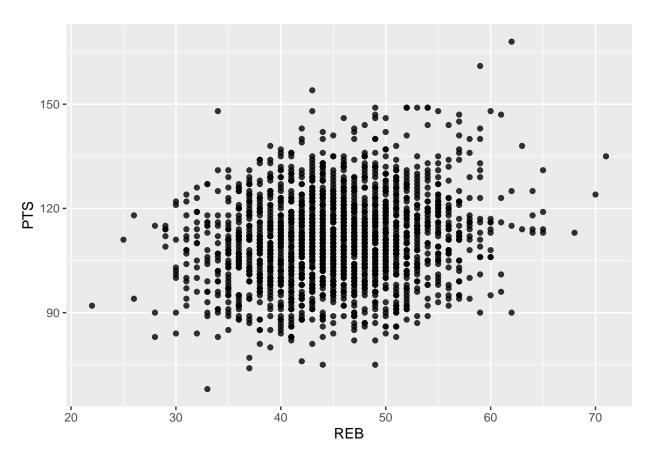
```
#summary(leftover)

#Initial exploratory graphs to check my initial thinking
#and also to explore other options

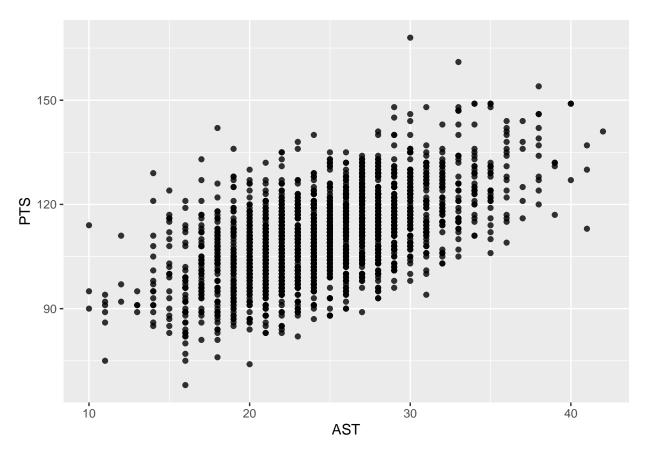
ggplot(data = leftover) +
   geom_point(mapping = aes(x = THREE_PTPERCENT, y = PTS), alpha = .8)
```



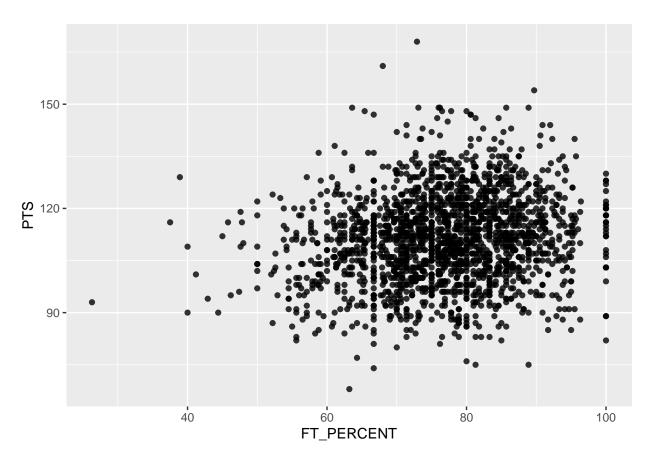
```
ggplot(data = leftover) +
geom_point(mapping = aes(x = REB, y = PTS), alpha = .8)
```



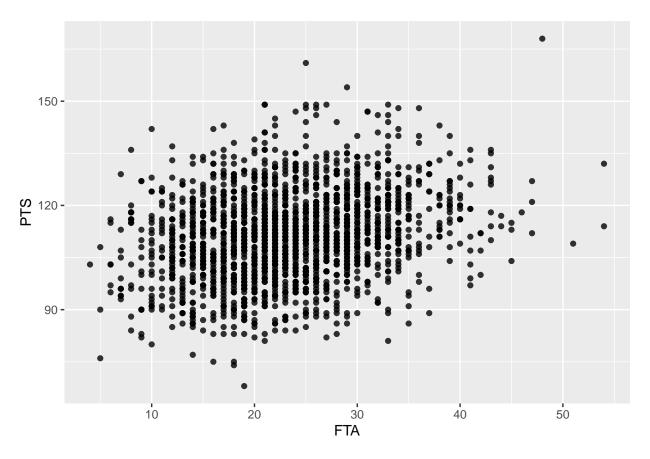
```
ggplot(data = leftover) +
geom_point(mapping = aes(x = AST, y = PTS), alpha = .8)
```



```
ggplot(data = leftover) +
geom_point(mapping = aes(x = FT_PERCENT, y = PTS), alpha = .8)
```



```
ggplot(data = leftover) +
geom_point(mapping = aes(x = FTA, y = PTS), alpha = .8)
```



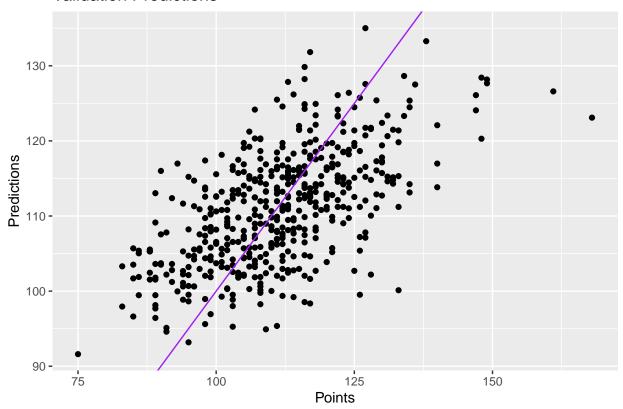
```
# The assists vs points graph has an expected increasing trend. Surprisingly the
# rebounds vs points did not have as strong of a relationship as I thought, but
# there is still an increasing trend. Free throw attempts and percentage were
# similar to the rebound graph. The three point percentage graph showed a pretty strong
# relationship to points, so maybe it could used as a variable in the future.

#Creating the training and validation sets
training_rows <- as.vector(createDataPartition(leftover$PTS, p = 0.75, list = FALSE))
validate_rows <- leftover[-training_rows, ]
training <- leftover[training_rows, ]
training</pre>
```

```
## # A tibble: 1,478 x 24
##
            'Match Up' 'Game Date' W_or_L
                                              MIN
                                                    PTS
                                                           FGM
                                                                 FGA FG_PERCENT
##
      <chr> <chr>
                                            <dbl> <dbl> <dbl> <dbl>
                                                                           <dbl>
                        <chr>
                                     <chr>
                                                                            49
##
    1 MEM
            MEM vs. G~ 04/10/2019
                                              240
                                                     132
                                                            48
                                                                  98
                                    W
    2 MIN
            MIN @ DEN 04/10/2019
                                                                            42.9
##
                                              240
                                                     95
                                                            39
                                                                  91
##
                                                     99
    3 DEN
            DEN vs. M~ 04/10/2019
                                              240
                                                            39
                                                                  87
                                                                            44.8
                                                                            45.9
##
    4 IND
            IND @ ATL 04/10/2019
                                              240
                                                     135
                                                            45
                                                                  98
    5 POR
            POR vs. S~ 04/10/2019
                                                                            58.2
##
                                    W
                                              240
                                                     136
                                                            53
                                                                  91
    6 UTA
            UTA @ LAC 04/10/2019
                                              265
                                                    137
                                                                 106
                                                                            44.3
    7 BKN
            BKN vs. M~ 04/10/2019
                                              240
                                                            43
                                                                            37.7
##
                                                    113
                                                                 114
##
    8 DET
            DET @ NYK 04/10/2019
                                              240
                                                     115
                                                            41
                                                                  85
                                                                            48.2
            NYK vs. D~ 04/10/2019 L
                                              240
                                                                  77
                                                                            40.3
##
  9 NYK
                                                     89
                                                            31
## 10 CHI
            CHI @ PHI 04/10/2019 L
                                              240
                                                     109
                                                            45
                                                                            47.4
\#\# ## ... with 1,468 more rows, and 15 more variables: THREE_PTM <dbl>,
```

```
THREE PTA <dbl>, THREE PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
## #
      FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
## #
      BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>
validate_rows
## # A tibble: 491 x 24
##
           'Match Up' 'Game Date' W_or_L
                                            MIN
                                                  PTS
                                                        FGM
                                                               FGA FG_PERCENT
##
      <chr> <chr>
                       <chr>
                                   <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
                                                                        <dbl>
##
   1 CHA
            CHA vs. 0~ 04/10/2019 L
                                            240
                                                  114
                                                         41
                                                               78
                                                                         52.6
  2 OKC
##
            OKC @ MIL 04/10/2019 W
                                            240
                                                  127
                                                          48
                                                               99
                                                                         48.5
## 3 PHI
           PHI vs. C~ 04/10/2019 W
                                                                         55.9
                                            240
                                                  125
                                                         52
                                                               93
## 4 BOS
           BOS @ WAS 04/09/2019 W
                                            240
                                                  116
                                                         45
                                                               99
                                                                         45.5
## 5 TOR
           TOR @ MIN 04/09/2019 W
                                            240
                                                  120
                                                         46
                                                               88
                                                                         52.3
## 6 MIN
           MIN vs. T~ 04/09/2019 L
                                            240
                                                  100
                                                                         41.8
                                                         38
                                                               91
## 7 POR
           POR @ LAL 04/09/2019 W
                                            240
                                                  104
                                                         37
                                                               90
                                                                         41.1
## 8 OKC
            OKC @ MIN 04/07/2019 W
                                            240
                                                  132
                                                         48
                                                               92
                                                                         52.2
## 9 ATL
            ATL @ MIL 04/07/2019 L
                                            240
                                                  107
                                                         40
                                                               100
                                                                         40
## 10 BOS
           BOS vs. 0~ 04/07/2019 L
                                                  108
                                                               89
                                                                         47.2
                                            240
                                                         42
## # ... with 481 more rows, and 15 more variables: THREE_PTM <dbl>,
      THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
## #
      FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
      BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>
## #
#Training my model on the training set
model <- lm(PTS ~ REB + AST, data = training)</pre>
predictions <- add_predictions(validate_rows, model)</pre>
predictions
## # A tibble: 491 x 25
      Team 'Match Up' 'Game Date' W or L
##
                                            MIN
                                                  PTS
                                                        FGM
                                                               FGA FG PERCENT
##
      <chr> <chr>
                                   <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
                       <chr>
                                                                        <db1>
##
  1 CHA
           CHA vs. 0~ 04/10/2019 L
                                            240
                                                  114
                                                         41
                                                               78
                                                                         52.6
## 2 OKC
           OKC @ MIL 04/10/2019 W
                                                               99
                                                                         48.5
                                            240
                                                  127
                                                          48
## 3 PHI
           PHI vs. C~ 04/10/2019 W
                                            240
                                                  125
                                                         52
                                                               93
                                                                         55.9
## 4 BOS
           BOS @ WAS 04/09/2019 W
                                            240
                                                  116
                                                         45
                                                               99
                                                                         45.5
## 5 TOR
           TOR @ MIN 04/09/2019 W
                                            240
                                                  120
                                                               88
                                                                         52.3
                                                         46
           MIN vs. T~ 04/09/2019 L
## 6 MIN
                                            240
                                                  100
                                                         38
                                                               91
                                                                         41.8
## 7 POR
           POR @ LAL 04/09/2019 W
                                            240
                                                  104
                                                         37
                                                               90
                                                                         41.1
## 8 OKC
                                                                        52.2
            OKC @ MIN 04/07/2019 W
                                            240
                                                  132
                                                         48
                                                               92
## 9 ATL
            ATL @ MIL 04/07/2019 L
                                            240
                                                  107
                                                               100
                                                                         40
                                                         40
                                                  108
           BOS vs. 0~ 04/07/2019 L
                                                                         47.2
## 10 BOS
                                            240
                                                         42
                                                               89
## # ... with 481 more rows, and 16 more variables: THREE_PTM <dbl>,
      THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
      FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
      BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>, pred <dbl>
## #
ggplot(data = predictions, mapping = aes(x = PTS, y = pred)) +
  geom_point() +
  geom_abline(intercept = 0, slope = 1, color = "purple") +
  labs(y = "Predictions", x = "Points", title = "Validation Predictions")
```

Validation Predictions



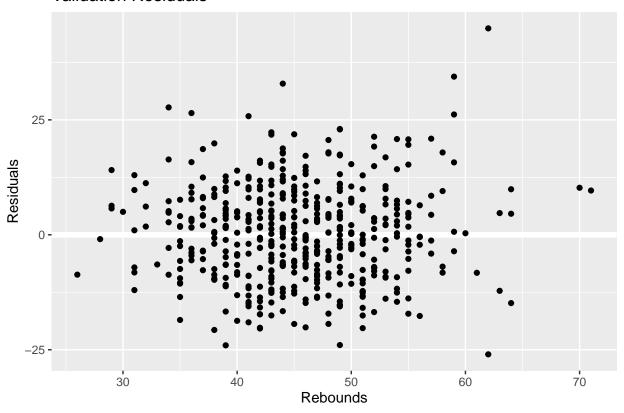
```
# At a glance my validation set predictions look decent. There are many points
# that are near the perfect prediction line, and there are points that fall directly on
# that line. Also there is a decently clear trend that follows the prediction line.
# However, there are also many clear outlier data values that can be seen on the graph.

validate_resid <- add_residuals(validate_rows, model)
validate_resid
```

```
## # A tibble: 491 x 25
            'Match Up' 'Game Date' W_or_L
##
                                              MIN
                                                    PTS
                                                          FGM
                                                                 FGA FG_PERCENT
      <chr> <chr>
                                    <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
                                                                          <dbl>
##
                        <chr>
    1 CHA
            CHA vs. 0~ 04/10/2019 L
                                              240
                                                                 78
                                                                           52.6
##
                                                    114
                                                           41
    2 OKC
            OKC @ MIL 04/10/2019
                                                                           48.5
##
                                              240
                                                    127
                                                           48
                                                                 99
            PHI vs. C~ 04/10/2019
##
    3 PHI
                                              240
                                                    125
                                                           52
                                                                 93
                                                                           55.9
##
    4 BOS
            BOS @ WAS 04/09/2019
                                    W
                                              240
                                                    116
                                                           45
                                                                 99
                                                                           45.5
    5 TOR
            TOR @ MIN 04/09/2019
                                              240
                                                    120
                                                           46
                                                                 88
                                                                           52.3
##
            MIN vs. T~ 04/09/2019
##
    6 MIN
                                              240
                                                    100
                                                           38
                                                                 91
                                                                           41.8
    7 POR
            POR @ LAL
                       04/09/2019
                                              240
                                                    104
                                                                           41.1
##
                                                           37
                                                                 90
            OKC @ MIN 04/07/2019
##
    8 OKC
                                    W
                                              240
                                                    132
                                                           48
                                                                 92
                                                                           52.2
##
    9 ATL
            ATL @ MIL 04/07/2019 L
                                              240
                                                    107
                                                           40
                                                                 100
                                                                           40
## 10 BOS
            BOS vs. 0~ 04/07/2019 L
                                              240
                                                    108
                                                                 89
                                                                           47.2
                                                           42
    ... with 481 more rows, and 16 more variables: THREE_PTM <dbl>,
      THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
## #
       FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
## #
       BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>, resid <dbl>
## #
```

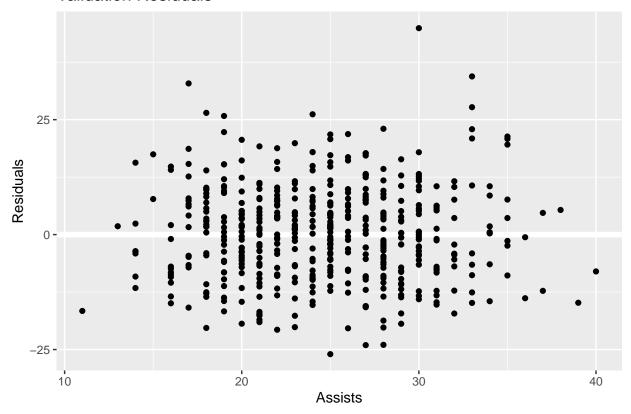
```
ggplot(validate_resid, aes(REB, resid)) +
  geom_ref_line(h = 0) +
  geom_point() +
  labs(y = "Residuals", x = "Rebounds", title = "Validation Residuals")
```

Validation Residuals



```
ggplot(validate_resid, aes(AST, resid)) +
  geom_ref_line(h = 0) +
  geom_point() +
  labs(y = "Residuals", x = "Assists", title = "Validation Residuals")
```

Validation Residuals



```
# Both of my residual graphs seem pretty solid. There does not seem to be any noticeable
# trends for both the assists and rebounds. This indicates that my model did a solid job at
# removing patterns that might have existed.
# Calculating goodness-of-fit measures for my model on the validation set
R2(predictions$pred, predictions$PTS)
```

[1] 0.3624039

MAE(predictions\$pred, predictions\$PTS)

```
## [1] 8.266143
```

RMSE(predictions\$pred, predictions\$PTS)

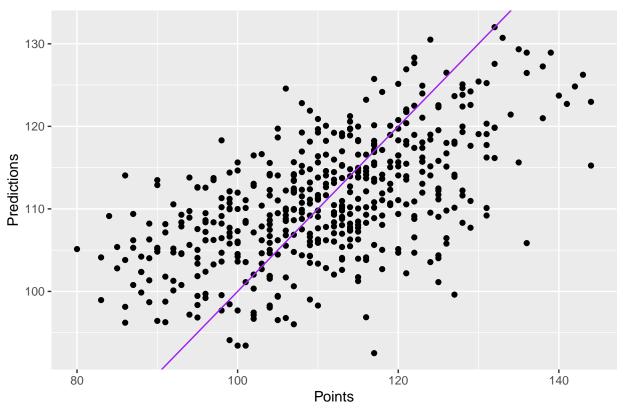
[1] 10.37754

model

```
##
## Call:
## lm(formula = PTS ~ REB + AST, data = training)
##
```

```
## Coefficients:
                                     AST
## (Intercept)
                        REB
       64.9079
                     0.2522
                                  1.4184
summary(model)
##
## Call:
## lm(formula = PTS ~ REB + AST, data = training)
## Residuals:
##
       Min
                10 Median
                                3Q
                                       Max
## -28.608 -7.123 -0.290
                             6.711
                                   39.707
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 64.90786
                           2.14620 30.243 < 2e-16 ***
                           0.04020
                                     6.275 4.6e-10 ***
                0.25221
## AST
                1.41842
                           0.05134 27.630 < 2e-16 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Residual standard error: 10.1 on 1475 degrees of freedom
## Multiple R-squared: 0.3615, Adjusted R-squared: 0.3606
## F-statistic: 417.5 on 2 and 1475 DF, p-value: < 2.2e-16
predictions <- add_predictions(test_set, model)</pre>
predictions
## # A tibble: 491 x 25
            'Match Up' 'Game Date' W or L
##
      Team
                                            MIN
                                                  PTS
                                                         FGM
                                                               FGA FG PERCENT
##
      <chr> <chr>
                       <chr>>
                                   <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
                                                                        <dbl>
##
   1 GSW
            GSW @ MEM 04/10/2019
                                            240
                                                  117
                                                          46
                                                                92
                                                                         50
   2 ORL
##
            ORL @ CHA 04/10/2019
                                            240
                                                   122
                                                          48
                                                                88
                                                                         54.5
## 3 MIL
           MIL vs. 0~ 04/10/2019
                                  L
                                            240
                                                          43
                                                               100
                                                                         43
                                                  116
## 4 ATL
            ATL vs. I~ 04/10/2019 L
                                            240
                                                  134
                                                          43
                                                               103
                                                                         41.7
                                            240
## 5 SAC
            SAC @ POR 04/10/2019 L
                                                  131
                                                          50
                                                                96
                                                                         52.1
## 6 LAC
            LAC vs. U~ 04/10/2019
                                            265
                                                   143
                                                          54
                                                               106
                                                                         50.9
## 7 MIA
            MIA @ BKN 04/10/2019 L
                                            240
                                                                         38.8
                                                   94
                                                          38
                                                                98
## 8 SAS
            SAS vs. D~ 04/10/2019
                                            240
                                                   105
                                                          41
                                                                88
                                                                         46.6
## 9 DAL
            DAL @ SAS 04/10/2019 L
                                            240
                                                   94
                                                          37
                                                                91
                                                                         40.7
## 10 NOP
            NOP vs. G~ 04/09/2019 L
                                            240
                                                   103
                                                          44
                                                                         44.4
## # ... with 481 more rows, and 16 more variables: THREE_PTM <dbl>,
       THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
       FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
## #
       BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>, pred <dbl>
ggplot(data = predictions, mapping = aes(x = PTS, y = pred)) +
  geom_point() +
  geom_abline(intercept = 0, slope = 1, color = "purple") +
 labs(y = "Predictions", x = "Points", title = "Test Predictions")
```

Test Predictions

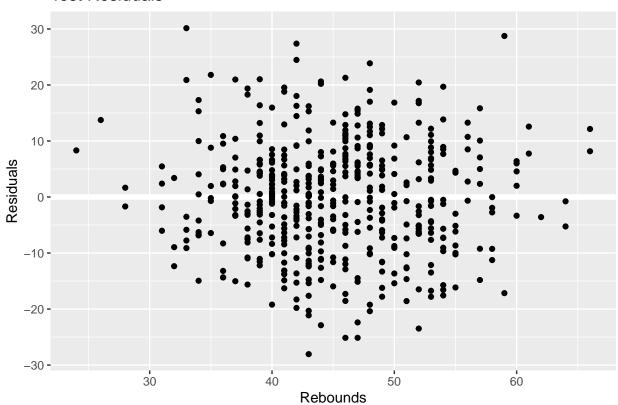


```
test_resids <- add_residuals(test_set, model)
test_resids</pre>
```

```
## # A tibble: 491 x 25
##
            'Match Up' 'Game Date' W_or_L
                                             MIN
                                                   PTS
                                                          FGM
                                                                FGA FG_PERCENT
##
      <chr> <chr>
                       <chr>
                                    <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
                                                                         <dbl>
    1 GSW
            GSW @ MEM 04/10/2019
                                                                          50
##
                                             240
                                                          46
                                                                 92
                                                   117
    2 ORL
            ORL @ CHA 04/10/2019
                                                                          54.5
##
                                   W
                                             240
                                                   122
                                                          48
                                                                 88
##
    3 MIL
            MIL vs. 0~ 04/10/2019 L
                                             240
                                                          43
                                                                100
                                                                          43
                                                   116
##
   4 ATL
            ATL vs. I~ 04/10/2019 L
                                             240
                                                   134
                                                          43
                                                                103
                                                                          41.7
##
    5 SAC
            SAC @ POR 04/10/2019 L
                                             240
                                                   131
                                                          50
                                                                96
                                                                          52.1
##
    6 LAC
            LAC vs. U~ 04/10/2019 W
                                             265
                                                   143
                                                                106
                                                                          50.9
                                                          54
                                                                          38.8
##
   7 MIA
            MIA @ BKN 04/10/2019 L
                                             240
                                                    94
                                                          38
                                                                 98
   8 SAS
            SAS vs. D~ 04/10/2019
                                             240
                                                                          46.6
##
                                                   105
                                                          41
                                                                 88
            DAL @ SAS 04/10/2019
##
   9 DAL
                                             240
                                                    94
                                                           37
                                                                 91
                                                                          40.7
## 10 NOP
            NOP vs. G~ 04/09/2019 L
                                             240
                                                   103
                                                          44
                                                                 99
                                                                          44.4
## # ... with 481 more rows, and 16 more variables: THREE_PTM <dbl>,
       THREE_PTA <dbl>, THREE_PTPERCENT <dbl>, FTM <dbl>, FTA <dbl>,
## #
## #
       FT_PERCENT <dbl>, OREB <dbl>, DREB <dbl>, REB <dbl>, AST <dbl>, STL <dbl>,
       BLK <dbl>, TOV <dbl>, PF <dbl>, 'PLUS/MINUS' <dbl>, resid <dbl>
## #
ggplot(data = test_resids, mapping = aes(x = REB, y = resid)) +
```

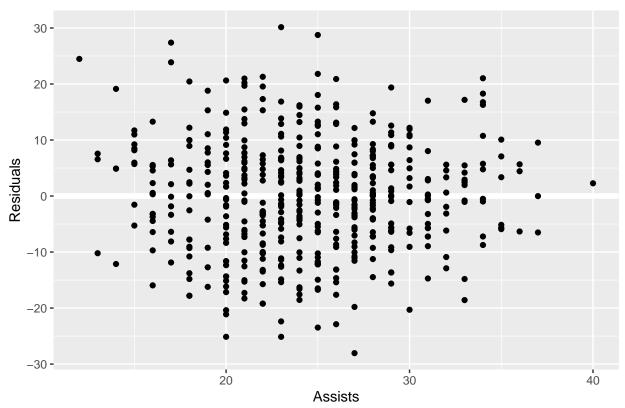
```
ggplot(data = test_resids, mapping = aes(x = REB, y = resid)) +
  geom_ref_line(h = 0) +
  geom_point() +
  labs(y = "Residuals", x = "Rebounds", title = "Test Residuals")
```

Test Residuals



```
ggplot(data = test_resids, mapping = aes(x = AST, y = resid)) +
  geom_ref_line(h = 0) +
  geom_point() +
  labs(y = "Residuals", x = "Assists", title = "Test Residuals")
```

Test Residuals



Calculating goodness-of-fit measures for my model on the test set
R2(predictions\$pred, predictions\$PTS)

[1] 0.3539825

MAE(predictions\$pred, predictions\$PTS)

[1] 7.950831

RMSE(predictions\$pred, predictions\$PTS)

[1] 9.936166

Observations

In general my model does a decent job at predicting points scored. When comparing my training and testing results, there is not anything to be too concerned about. The prediction results of each are very similar and both visualtions in the same way display that my model could definitely be improved. Between the residual graphs of training and testing, there are not any major discrepancies that need to be addressed.

My R², MAE, RMSE values are also similar between testing and training.

For training:

- $R^2 = 0.3624039$
- MAE = 8.266143
- RMSE = 10.37754

For testing:

- $R^2 = 0.3539825$
- MAE = 7.950831
- RMSE = 9.936166

There does not seem to be any evidence of overfitting or extremely better performance with the test set. In testing my model actually showed slightly worst performance than in training.

Potential Social and Ethical Implications

In recent years basketball has become more reliant on analytics, but there are still many unmeasurable factors during a basketball game. A simple model like mine doesn't really have enough substance to fully confirm that assists and rebounds lead to more points. It does a decent job at getting a general understanding of how these variables can affect the points scored. Ethically this model could be used to present misleading information about the effects of rebounding and total assists. For example, I could choose a prediction value that happens to be a perfect prediction and use that as confirmation bias for the general belief that "Better rebounding = more points scored". But in reality that statement is not completely true.

Fine tuning my goal

My initial model gave a good general idea about more in depth relationships between my variables. I would still like to be able to analyze home court advantage, but I need to make adjustments and changes to my datasets in order to make that happen.