# Week 2.3 - Summary Statistics and Correlation Analysis

#### Import Updated NBA Game Data

```
library(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.0 --
## v ggplot2 3.3.2
                     v purrr
                               0.3.4
## v tibble 3.0.3
                     v dplyr
                               1.0.0
## v tidyr
          1.1.0
                     v stringr 1.4.0
## v readr
          1.3.1
                     v forcats 0.5.0
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(gridExtra)
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
      combine
library(lubridate)
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
      date, intersect, setdiff, union
##
NBA_Games = read.csv("~/Google Drive/Sports Analytics Moocs/MOOC 1 - Foundations of sports analytics/We
head(NBA_Games)
##
       CITY
                TEAM NAME
                            TEAM ID NICKNAME
                                              STATE YEAR_FOUNDED SEASON_ID
## 1 Atlanta Atlanta Hawks 1610612737
                                      Hawks Atlanta
                                                           1949
                                                                    22019
## 2 Atlanta Atlanta Hawks 1610612737
                                      Hawks Atlanta
                                                           1949
                                                                    22019
## 3 Atlanta Atlanta Hawks 1610612737 Hawks Atlanta
                                                           1949
                                                                    22019
## 4 Atlanta Atlanta Hawks 1610612737 Hawks Atlanta
                                                           1949
                                                                    22019
## 5 Atlanta Atlanta Hawks 1610612737
                                      Hawks Atlanta
                                                           1949
                                                                   22019
## 6 Atlanta Atlanta Hawks 1610612737
                                      Hawks Atlanta
                                                           1949
                                                                    22018
    TEAM ABBREVIATION
                        GAME_ID GAME_DATE
                                              MATCHUP WL MIN PTS FGM FGA FG PCT
## 1
                 ATL 1521900072 2019-07-12
                                           ATL @ SAS W 201
                                                             80
                                                                 27
                 ATL 1521900060 2019-07-11
## 2
                                           ATL @ WAS
                                                      L 200
                                                             71
                                                                 26
                                                                    68 0.382
## 3
                 ATL 1521900042 2019-07-09 ATL vs. IND
                                                      W 202
                                                             87
                                                                 31
                                                                    60
                                                                        0.517
## 4
                 ATL 1521900023 2019-07-07 ATL vs. MIN L 178
                                                             60
                                                                18
## 5
                 ATL 1521900013 2019-07-06
                                            ATL @ MIL L 201
                                                             83
                                                                 25 73
                       21801220 2019-04-10 ATL vs. IND L 240 134 43 103 0.417
## 6
```

FG3M FG3A FG3\_PCT FTM FTA FT\_PCT OREB DREB REB AST STL BLK TOV PF PLUS\_MINUS

```
## 1
         9
              32
                    0.281
                            17
                                 20
                                      0.850
                                                13
                                                     23
                                                          36
                                                               14
                                                                    15
                                                                          3
                                                                             12 24
                                                                                             8.0
## 2
        12
              29
                    0.414
                             7
                                                9
                                                     28
                                                          37
                                                               19
                                                                    10
                                                                          8
                                                                             22 25
                                 10
                                      0.700
                                                                                            -5.0
                    0.381
## 3
         8
              21
                            17
                                 24
                                      0.708
                                                 7
                                                     27
                                                          34
                                                               17
                                                                     5
                                                                          5
                                                                             18 21
                                                                                            18.2
                                                                                           -24.0
## 4
         4
              22
                    0.182
                            20
                                 32
                                      0.625
                                                          36
                                                                7
                                                                     7
                                                                         10
                                                                             18 28
                                                 9
                                                     27
## 5
        10
              32
                    0.313
                            23
                                 26
                                      0.885
                                                9
                                                     30
                                                          39
                                                               13
                                                                    11
                                                                          6
                                                                             13 21
                                                                                             2.0
   6
                                                               29
                                                                     5
                                                                             17 25
##
        17
              41
                    0.415
                            31
                                 38
                                      0.816
                                                22
                                                     39
                                                          61
                                                                          7
                                                                                            -1.0
      WIN
##
## 1
        1
## 2
        0
## 3
        1
## 4
        0
        0
## 5
## 6
        0
```

#### More on Summary Statistics

#### Central Tendency vs. Variation

We will compare the success rates of two-point field goals and three-point field goals to demonstrate the difference between central tendency and variation.

# Calculate summary statistics for the percentages of two-point field goals and three-point field goals

• Two-point field goals

```
summary(NBA_Games$FG_PCT)
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
   0.2170 0.4140 0.4520
                            0.4525 0.4890
                                            0.6840
sd(NBA_Games$FG_PCT)
## [1] 0.05643599
  • Three-point field goals
summary(NBA_Games$FG3_PCT)
##
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
   0.0000 0.2860 0.3490
                            0.3506 0.4170
                                            0.8420
sd(NBA_Games$FG3_PCT)
```

## [1] 0.09947898

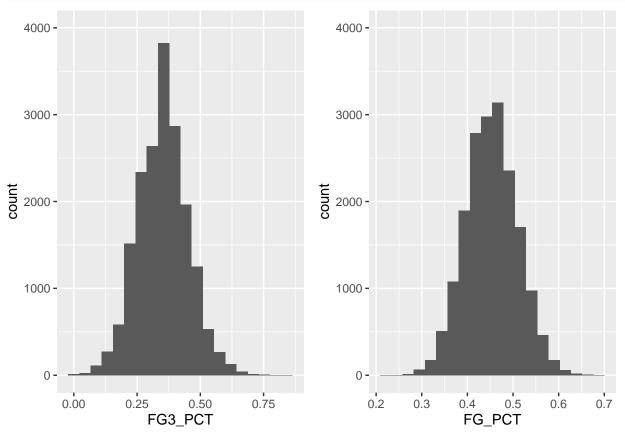
We can see that the average success rate of 2-point field goals is about 45.27% while the average success rate of 3-point field goals is 35.07%. That means that the overall success rate of 2-point field goals is about 10% higher than the overall success rate of 3-point field goals. The median of 2-point field goal success rate is 45.20%, while the median 3-point field goal success rate is 35.00%. This means half of the teams have 2-point field-goal success rates less than 45% and half of the teams have 3-point field goal success rate of less than 35%.

The standard deviation for 2-point field goal success rate is 0.056, while the standard deviation for 3-point field goal success rate is 0.09956. This means that there is a greater variation in 3-point field goals than 2-point field goals.

Compare the distribution of two-point field goal percentage and three-point field goal percentage using a Histogram

Plot two histograms side by side The options "scale\_x\_continous" and "scale\_y\_continuous" can be used to restrict the same range of x and same range of y for the two histograms

```
p1 <- ggplot(NBA_Games, aes(x=FG3_PCT)) +
   geom_histogram(bins=20) + scale_y_continuous(limits = c(0, 4000))
p2 <- ggplot(NBA_Games, aes(x=FG_PCT)) +
   geom_histogram(bins=20) + scale_y_continuous(limits = c(0, 4000))
grid.arrange(p1,p2,ncol=2)</pre>
```

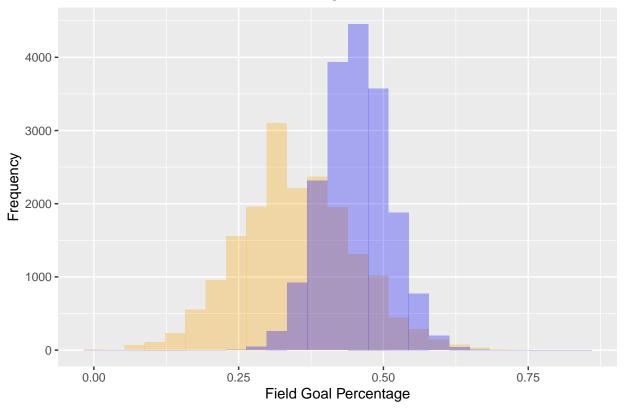


Plot two histograms in the same graph in different colors

We will first introduce a new library "ggplot2" that provides more useful functions to make plots.

- The option "alpha" specifies transparency, so that the two histograms would not block each other entirely (alpha=0: fully transparent; alpha=1: fully opaque)
- We can also add a title and axis labels using the "labs" command
- We can change the color of the histograms by using the "fill" option
- We can also export the graph as a png file using the "ggsave" command

## Distributions of Field Goal Percentages

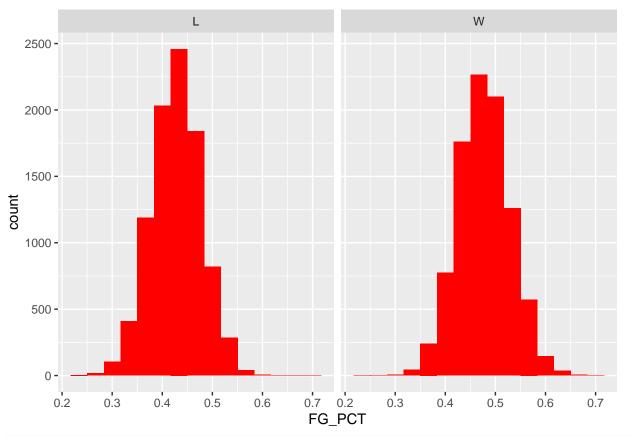


ggsave("FG\_PCT\_Distributions.png")

## Saving 6.5 x 4.5 in image

## Histogram by the result of the game using the "facet\_wrap" option

```
ggplot(NBA_Games, aes(x=FG_PCT)) +
geom_histogram(bins=15, fill = 'red') +
facet_wrap(~WL)
```



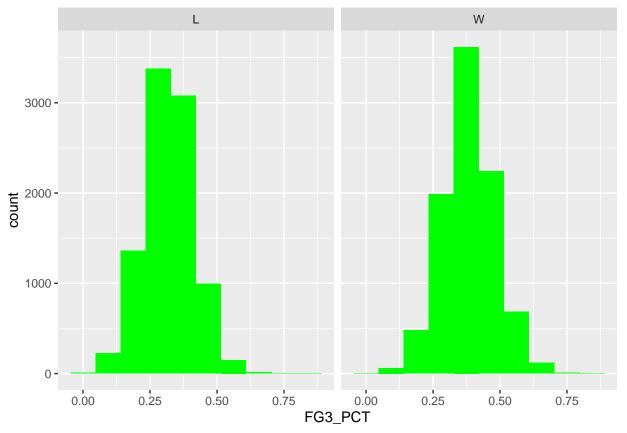
```
ggsave("FG_PCT_WL.png")
```

## Saving 6.5 x 4.5 in image

#### Self Test

- 1. Calculate summary statistics for the three-point field goal percentage by the result of the game
- 2. Graph a histogram of the three-point field goal percentage by the result of the game and provide interpretation
- Number of bins=10, the two subgraphs should have the same x and y ranges, color is green
- Export the graph as "FG3\_PCT\_Distribution" in png format

```
## 'summarise()' ungrouping output (override with '.groups' argument)
## # A tibble: 2 x 9
##
           count mean
                           sd
                                min
                                      q25 median
                                                    q75
##
     <chr> <int> <dbl> <dbl> <dbl> <dbl> <dbl>
                                            <dbl> <dbl> <dbl>
## 1 L
            9208 0.319 0.0915
                                  0 0.259 0.318 0.379 0.714
## 2 W
            9206 0.382 0.0969
                                   0 0.318 0.381 0.444 0.842
ggplot(NBA_Games, aes(x=FG3_PCT)) +
  geom_histogram(bins=10, fill = 'green') +
 facet_wrap(~WL)
```



ggsave("FG3\_PCT\_Distribution.png")

## Saving  $6.5 \times 4.5$  in image

#### Create time series graphs

Let's first change the data type of "GAME\_DATE" from object to date time. Since the GAME\_DATE variable is in Year/Month/Day format, we can use the ymd () function from the lubridate package.

```
NBA_Games$GAME_DATE = ymd(NBA_Games$GAME_DATE)
head(NBA_Games$GAME_DATE)
```

```
## [1] "2019-07-12" "2019-07-11" "2019-07-09" "2019-07-07" "2019-07-06" ## [6] "2019-04-10"
```

#### Subsetting a dataset

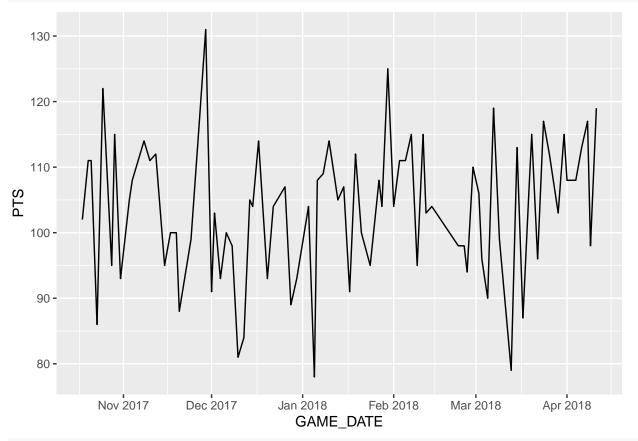
The dataset we are working with contains games of different NBA teams. Let's focus on one team to produce a time series graph. Extract Pistons' game data in the 2017-2018 season.

Note that for date variable, we can use the >, =, < operators. When we specify the condition of the date, we need to use '' and make sure that it is a datetime variable.

```
##
        CITY
                    TEAM_NAME
                                  TEAM_ID NICKNAME
                                                       STATE YEAR FOUNDED SEASON ID
## 1 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
                                                                      1948
                                                                                22017
                                                                      1948
                                                                                22017
## 2 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
## 3 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
                                                                      1948
                                                                                22017
## 4 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
                                                                      1948
                                                                                22017
## 5 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
                                                                      1948
                                                                                22017
## 6 Detroit Detroit Pistons 1610612765
                                           Pistons Michigan
                                                                      1948
                                                                                22017
     TEAM_ABBREVIATION GAME_ID GAME_DATE
                                                 MATCHUP WL MIN PTS FGM FGA FG PCT
##
                    DET 21701224 2018-04-11
## 1
                                                DET @ CHI
                                                          W 240 119
                                                                           89
                                                                                0.528
                                                                       47
## 2
                    DET 21701204 2018-04-09 DET vs. TOR
                                                                           78
                                                                                0.449
                                                           L 239
                                                                   98
                                                                       35
                    DET 21701199 2018-04-08
                                                DET @ MEM
                                                                                0.409
## 3
                                                           L 240 117
                                                                       38
                                                                           93
## 4
                    DET 21701181 2018-04-06 DET vs. DAL
                                                           W 265 113
                                                                       46
                                                                           92
                                                                                0.500
## 5
                    DET 21701169 2018-04-04 DET vs. PHI
                                                           L 240 108
                                                                       39
                                                                           88
                                                                                0.443
## 6
                    DET 21701148 2018-04-01
                                                DET @ BKN
                                                           W 240 108
                                                                       38
                                                                                0.452
     FG3M FG3A FG3_PCT FTM FTA FT_PCT OREB DREB REB AST
##
                                                           STL BLK TOV PF
                                                                           PLUS MINUS
## 1
       15
            35
                  0.429
                         10
                             10
                                  1.000
                                           7
                                                40
                                                    47
                                                        27
                                                            12
                                                                  4
                                                                     11 21
                                                                                    32
## 2
        9
            30
                  0.300
                         19
                             25
                                  0.760
                                           4
                                                29
                                                    33
                                                        22
                                                             7
                                                                  2
                                                                      3 11
                                                                                   -10
## 3
       23
                         18
                                  0.783
                                                    38
                                                        30
                                                                  0
            47
                  0.489
                             23
                                          14
                                                24
                                                             10
                                                                     12 18
                                                                                   -13
## 4
       12
            30
                  0.400
                          9
                             17
                                  0.529
                                           6
                                                43
                                                    49
                                                        24
                                                              6
                                                                  4
                                                                     11 19
                                                                                     7
                                  0.609
## 5
       16
                         14
                             23
                                           9
                                                33
                                                    42
                                                        30
                                                              4
                                                                  5
                                                                     17 19
                                                                                    -7
            36
                  0.444
##
  6
        7
            19
                  0.368
                         25
                             32
                                  0.781
                                          10
                                                43
                                                    53
                                                        17
                                                                  3
                                                                      9 16
                                                                                    12
##
     WIN
## 1
       1
## 2
       0
## 3
       0
## 4
       1
## 5
       0
## 6
       1
```

Now we can plot the points earned by the Pistons by time.

```
ggplot(data = Pistons_Games, aes(x=GAME_DATE, y=PTS)) + geom_line() +
scale_x_date(date_breaks = "1 month", date_labels = "%b %Y")
```

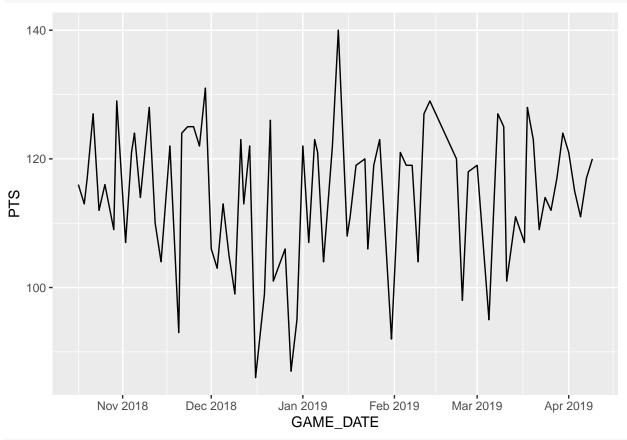


ggsave('PISTONS\_PTS\_TIME.png')

## Saving  $6.5 \times 4.5$  in image

#### Self Test

- 1. Graph Toronto Raptors' points in each game throughout the 2018-2019 seaon. (SEASON ID is 22018, and the regular season started on October 16, 2018.)
- 2. Export the graph as "RAPTORS\_PTS\_TIME" in png format



ggsave('RAPTORS\_PTS\_TIME.png')

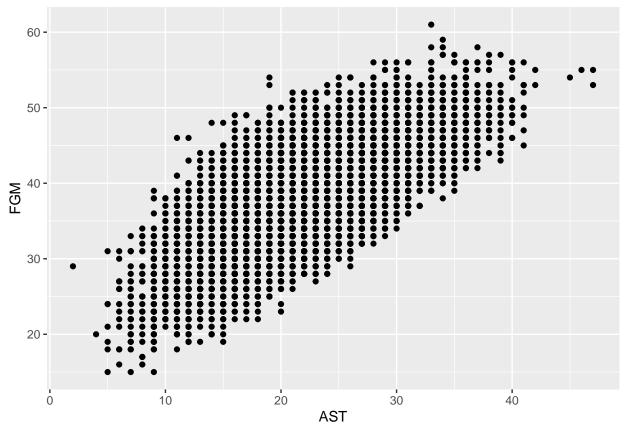
## Saving  $6.5 \times 4.5$  in image

## Correlation Analysis

We can first detect the relationship between two variables in a scatterplot.

Let's use the number of assists and the number of field goals made as an example. We can create a scatter plot using the "geom\_point()" function with the number of assists in the horizontal axis and the number of field goals made in the vertical axis.

ggplot(NBA\_Games, aes(x=AST, y=FGM)) + geom\_point() 60 -

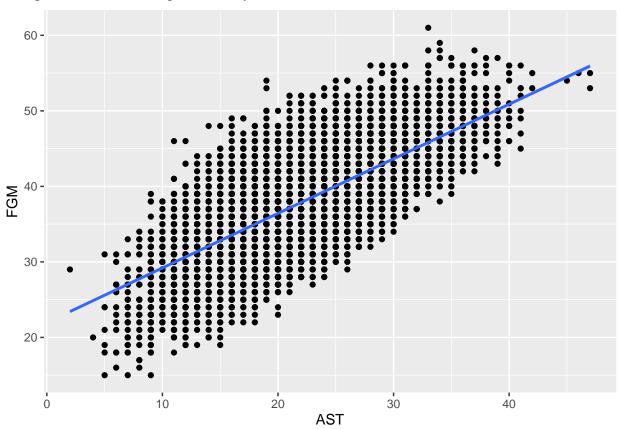


We can use the functions in the "ggplot2" library to graph the relationships between two variables

We will again use the function "geom\_point()" to graph the scatter plot of the two variables, along with the geom\_smooth(method=lm) function to add a regression line. \_theme() can be used to adjust the size of the plot title. We will learn about regression analysis more systematically in week 4

```
ggplot(NBA_Games, aes(x=AST, y=FGM)) + geom_point() +
geom_smooth(method=lm)
```

## 'geom\_smooth()' using formula 'y ~ x'



As we can see from the graph, as the number of assists increase, the number of field goals made also increases. In this case, we say there is a positive relationship between the two variables, or a positive correlation.

#### **Correlation Coefficient**

```
cor(x = NBA_Games$AST, y = NBA_Games$FGM)
```

We can quantify the linear correlation by a correlation coefficient. A correlation coefficient measures the joint variability of two random variables. We can calculate correlation coefficient using the "cor" function.

```
## [1] 0.6985104
```

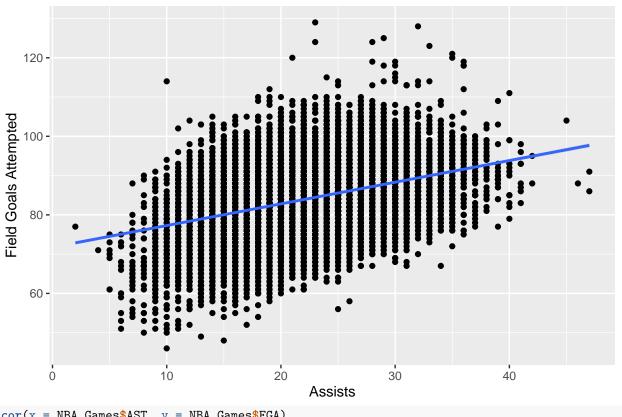
The correlation coefficient between the number of assist and field goal made is 0.70 so there is a positive correlation between the two.

Let's investigate the relationship between the number of assists and the number of field goals attempted.

```
ggplot(NBA_Games, aes(x=AST, y=FGA)) + geom_point() +
  geom_smooth(method=lm) +
  labs(title = "Relationship between the Numbers of Assists and Field Goals Attempted",
      x = "Assists", y = "Field Goals Attempted")
```

## 'geom\_smooth()' using formula 'y ~ x'

# Relationship between the Numbers of Assists and Field Goals Attempted



cor(x = NBA\_Games\$AST, y = NBA\_Games\$FGA)

## [1] 0.3609691

Both the graph and the correlation coefficient suggest that there is only a slight positive relationship between the two.

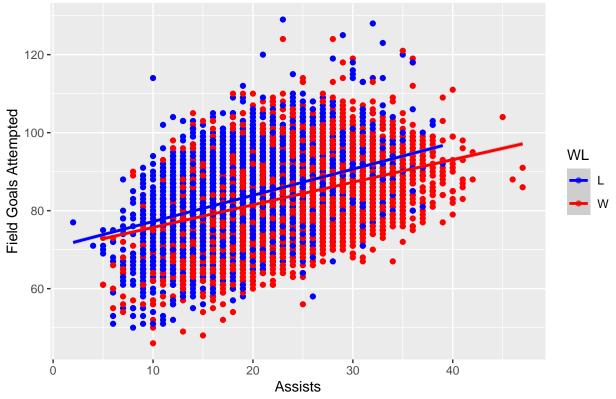
We can further graph the scatter plot by group using the "color" option.

Let's separate by the results of the game (win or lose), and produce scatter plots between number of assists and field goals made. \_In this case, we can use scale\_color\_manual() to define the colors of the groups.

```
ggplot(NBA_Games, aes(x=AST, y=FGA, color = WL)) + geom_point() +
    scale_color_manual(values = c("W" = "red", "L" = "blue")) +
    geom_smooth(method=lm) +
    labs(title = "Relationship between the Numbers of Assists and Field Goals Attempted",
        x = "Assists", y = "Field Goals Attempted") +
    theme(plot.title = element_text(size = 15))
```

## 'geom\_smooth()' using formula 'y ~ x'

## Relationship between the Numbers of Assists and Field Goals At



### We can also find correlation coefficients for all the numerical variables. By default, the method for cor() is pearson.

```
cor(NBA_Games[sapply(NBA_Games, is.numeric)])
```

```
##
                   TEAM_ID YEAR_FOUNDED
                                           SEASON_ID
## TEAM_ID
               1.000000000 0.1588052105 -0.0295408140 -2.637992e-03
## YEAR_FOUNDED
               0.158805211
                           1.0000000000 -0.0077786849 6.079689e-04
## SEASON_ID
              -0.029540814 -0.0077786849 1.0000000000 -1.579237e-02
## GAME ID
              -0.002637992  0.0006079689  -0.0157923664  1.000000e+00
## MIN
               ## PTS
              -0.039884976 -0.0254269250 -0.0003129511 -3.884716e-01
## FGM
              -0.022825843 -0.0270663820 -0.0021129693 -4.013296e-01
## FGA
              -0.017755019 -0.0583060002 -0.0082074116 -4.310109e-01
              -0.013090610 0.0161846813 0.0055797708 -1.591172e-01
## FG_PCT
```

```
## FG3M
              -0.113089239 -0.0815503389 0.0308067797 -1.344295e-01
## FG3A
              -0.141616974 -0.1054893820 0.0352985750 -9.362936e-02
## FG3 PCT
              -0.016015665 -0.0052349411 0.0087968862 -1.068484e-01
               ## FTM
## FTA
               ## FT PCT
              -0.014278454 0.0486494945 0.0268498725 -8.395157e-02
## OREB
               0.036325923 - 0.0349350307 - 0.0084665475 - 2.276964e - 02
## DREB
              -0.003939985 -0.0325228140 -0.0323333859 -2.521288e-01
## REB
               0.017363256 -0.0468894004 -0.0316934568 -2.225653e-01
## AST
              -0.100172234 -0.0733766974 -0.0367404525 -3.612030e-01
## STL
              -0.010541559 -0.0268677600 -0.0769045479 1.768021e-02
               ## BLK
## TOV
              -0.027440097 -0.0910463681 -0.1525784539 9.067403e-02
               0.010287613 -0.0443062127 -0.0364253553 1.127954e-01
## PF
## PLUS_MINUS
               ## WIN
              -0.004291493
                          0.0186777597 -0.0020511309
                                                    1.039780e-03
                                    PTS
##
                       MIN
                                                FGM
                                                            FGA
                                                                     FG_PCT
## TEAM ID
               7.453932e-03 -0.0398849762 -0.022825843 -0.017755019 -0.013090610
              5.199108e-03 -0.0254269250 -0.027066382 -0.058306000
## YEAR_FOUNDED
                                                                0.016184681
## SEASON ID
               3.692748e-02 -0.0003129511 -0.002112969 -0.008207412
                                                                0.005579771
## GAME ID
              -8.015957e-01 -0.3884716361 -0.401329625 -0.431010910 -0.159117180
               1.000000e+00 0.4280092213 0.421932627 0.521587224
## MIN
                                                                0.108377190
## PTS
               4.280092e-01
                           1.0000000000
                                        0.868216201
                                                    0.452361697
                                                                0.687991686
## FGM
               4.219326e-01
                            0.8682162006
                                        1.000000000
                                                    0.569484505
                                                                0.752175726
## FGA
               5.215872e-01
                            0.4523616971 0.569484505
                                                    1.000000000 -0.106607870
## FG PCT
               1.083772e-01
                            0.6879916863
                                        0.752175726 -0.106607870
                                                                1.000000000
## FG3M
               1.483303e-01
                            0.5526683490
                                        0.388573632
                                                    0.210874799
                                                                0.299034324
## FG3A
               1.356860e-01
                           0.3332616569
                                        0.192631937
                                                    0.353799073 -0.052006144
## FG3_PCT
               8.129105e-02 0.4608578469 0.369409879 -0.060976905 0.499490725
## FTM
                            0.2912516010 -0.151859801 -0.175009124 -0.039546404
               8.469851e-02
## FTA
               6.327768e-02
                            0.2317531723 -0.175986677 -0.192178000 -0.055475483
## FT_PCT
               5.982881e-02
                            0.1843393735
                                        0.035788564
                                                    0.010796011
                                                                0.036056912
## OREB
               8.043540e-02
                            0.0181821919
                                        0.027142830
                                                    0.456740058 -0.328142016
## DREB
               3.007131e-01
                            0.2514705681
                                        0.229918989
                                                    0.270132526
                                                                0.065507119
## REB
               2.957235e-01
                            0.2194115786
                                        0.206583983
                                                    0.484100673 -0.131973746
                                                               0.554726622
## AST
               3.316692e-01 0.6479763285
                                        0.698510369
                                                    0.360969053
## STL
               6.525458e-03
                            0.0905520809
                                        0.077970470
                                                    0.094883051
                                                                0.016110074
               6.103890e-02 0.0798412818 0.079702662 0.051503767
## BLK
                                                                0.054380649
## TOV
              -4.068858e-02 -0.1374207831 -0.176216496 -0.294181525
                                                                0.021875175
               ## PF
## PLUS MINUS
               9.593479e-05
                            0.5098332969
                                        0.452970742 0.005459368
                                                                0.540105069
                            0.4090209735
                                        0.341178143 -0.039797933
                                                               0.443240067
## WTN
              -1.507787e-03
                      FG3M
                                 FG3A
                                          FG3 PCT
                                                         FTM
                                                                    FTA
              -0.1130892395 -0.14161697 -0.016015665
## TEAM_ID
                                                  0.02227621
                                                              0.02786119
## YEAR_FOUNDED -0.0815503389 -0.10548938 -0.005234941
                                                  0.04344104
                                                              0.02332889
## SEASON_ID
               0.0308067797
                           0.03529857
                                       0.008796886 -0.01569464 -0.02996822
## GAME_ID
              -0.1344294727 -0.09362936 -0.106848382 -0.04260489 -0.00951476
## MIN
               0.1483303390
                            0.13568601
                                       0.081291052 0.08469851
                                                              0.06327768
## PTS
               0.5526683490
                            0.33326166
                                       0.460857847 0.29125160
                                                              0.23175317
## FGM
               0.3885736322
                            0.19263194
                                       0.369409879 -0.15185980 -0.17598668
## FGA
               ## FG_PCT
               0.2990343244 -0.05200614
                                      0.499490725 -0.03954640 -0.05547548
## FG3M
               1.000000000 0.75904420
                                       0.666182242 -0.09530354 -0.11615225
## FG3A
               0.7590441994 1.00000000 0.062440564 -0.07540220 -0.08728871
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## FG3 PCT
                ## FTM
                -0.0953035366 -0.07540220 -0.061309408
                                                      1.00000000
                                                                   0.92373805
## FTA
                -0.1161522540 -0.08728871 -0.080596111
                                                       0.92373805
                                                                   1.00000000
## FT_PCT
                0.0348080584
                              0.01774149
                                          0.033901753
                                                       0.32752275 -0.03529480
## OREB
                -0.1066689155
                              0.02503098 -0.188549381
                                                       0.05580948
                                                                   0.09612107
## DREB
                0.1404600005
                             0.16057135 0.037596482
                                                       0.05063983
                                                                   0.04665325
## REB
                0.0561777113
                              0.14772614 -0.075868041
                                                       0.07381262
                                                                   0.09340164
## AST
                0.4563270005
                              0.27329280
                                          0.382781408 -0.12610078 -0.14969899
## STL
                0.0003664217
                              0.03156353 -0.030837315
                                                       0.05813545
                                                                   0.07428818
## BLK
                 0.0194835778
                             0.01512009
                                          0.011487529
                                                       0.01897123
                                                                   0.02208668
## TOV
                -0.0391799076 -0.05059493 -0.005661024
                                                       0.04388451
                                                                   0.06512564
## PF
                0.0086207112
                              0.03050515 -0.020345759
                                                       0.21533864
                                                                   0.24303954
## PLUS_MINUS
                0.3169970338 0.07260749
                                          0.387306075
                                                       0.10750007
                                                                   0.06680181
                 0.2301023578
                                          0.320473977
##
  WIN
                              0.01741796
                                                       0.14273231
                                                                   0.11319623
##
                     FT_PCT
                                    OREB
                                                 DREB
                                                              REB
                                                                          AST
## TEAM_ID
                -0.014278454
                             0.036325923 -0.003939985
                                                       0.01736326 -0.10017223
  YEAR_FOUNDED
                0.048649495 -0.034935031 -0.032522814 -0.04688940 -0.07337670
## SEASON ID
                0.026849872 - 0.008466548 - 0.032333386 - 0.03169346 - 0.03674045
## GAME ID
                -0.083951569 -0.022769641 -0.252128802 -0.22256528 -0.36120296
## MIN
                0.059828812 0.080435396
                                          0.300713118
                                                       0.29572354
                                                                   0.33166915
## PTS
                0.184339374
                             0.018182192
                                          0.251470568
                                                       0.21941158
                                                                   0.64797633
## FGM
                0.035788564
                             0.027142830
                                          0.229918989
                                                       0.20658398
                                                                   0.69851037
                                          0.270132526
                                                       0.48410067
                                                                   0.36096905
## FGA
                0.010796011
                             0.456740058
## FG PCT
                0.036056912 -0.328142016
                                          0.065507119 -0.13197375
                                                                   0.55472662
## FG3M
                 0.034808058 -0.106668915
                                          0.140460000
                                                       0.05617771
                                                                   0.45632700
## FG3A
                0.017741488 0.025030983
                                          0.160571347
                                                       0.14772614
                                                                   0.27329280
## FG3_PCT
                 0.033901753 -0.188549381
                                          0.037596482 -0.07586804
                                                                   0.38278141
## FTM
                0.327522754
                             0.055809481
                                          0.050639834
                                                       0.07381262 -0.12610078
## FTA
                -0.035294797
                             0.096121069
                                          0.046653246
                                                      0.09340164 -0.14969899
                                          0.019985191 -0.03428887
## FT PCT
                1.00000000 -0.089595966
                                                                   0.03807435
## OREB
                -0.089595966
                            1.000000000 -0.014916309
                                                       0.55576236 -0.08280316
## DREB
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                                          1.00000000
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## REB
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                                          0.822958793
                                                       1.00000000
                                                                   0.13231550
## AST
                                          0.215725314
                                                       0.13231550
                0.038074347 -0.082803161
                                                                   1.00000000
## STL
                             0.024586537 -0.158647679 -0.11793584
                -0.023151264
                                                                   0.07731081
## BLK
                0.002170496
                             0.001452039
                                          0.216567729
                                                      0.18088671
                                                                   0.09546942
## TOV
                -0.042257932
                            0.027153920
                                          0.099490010 0.09814724 -0.07218473
                -0.030977470 0.050855811 -0.047438484 -0.01054750 -0.05675745
## PF
                                          0.398735693
## PLUS MINUS
                0.120731857 -0.014894161
                                                       0.32305997
                                                                   0.37759330
                 0.096915274 -0.033593907
                                          0.327944215
## WIN
                                                       0.25357702
                                                                   0.28691969
                                                   TOV
                                                                  PF
##
                         STL
                                      BLK
                              0.001361925 -0.027440097
## TEAM ID
                -0.0105415591
                                                        0.0102876129
## YEAR FOUNDED -0.0268677600
                              0.006516681 -0.091046368 -0.0443062127
                -0.0769045479 -0.001358738 -0.152578454 -0.0364253553
## SEASON_ID
## GAME_ID
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## MIN
                 0.0065254576
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                                                        0.0002446366
## PTS
                 0.0905520809
                              0.079841282 -0.137420783
                                                        0.0813209679
## FGM
                 0.0779704701
                              0.079702662 -0.176216496 -0.0198513556
## FGA
                 0.0948830506
                              0.051503767 -0.294181525 -0.0036630612
## FG_PCT
                 0.0161100741
                              ## FG3M
                              0.019483578 -0.039179908
                                                        0.0086207112
                0.0003664217
## FG3A
                 0.0315635285
                              0.015120090 -0.050594931
                                                        0.0305051546
## FG3 PCT
                              0.011487529 -0.005661024 -0.0203457594
                -0.0308373153
## FTM
                 0.0581354495 0.018971226 0.043884513 0.2153386411
```

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## FTA
             ## FT PCT
            ## OREB
             0.0245865369  0.001452039  0.027153920  0.0508558114
## DREB
            ## REB
            -0.1179358359
                        ## AST
             ## STL
             1.000000000 0.005052785 0.129837398 0.0497978498
## BLK
             0.0050527846
                        1.000000000 0.042207789
                                              0.0088073089
## TOV
             0.1298373977
                         0.042207789
                                   1.000000000
                                              0.2195526518
## PF
             ## PLUS_MINUS
             0.1662938990
                         0.183126363 -0.123858647 -0.0516344493
                         0.165842235 -0.107469182 -0.1043934371
## WIN
             0.1362045164
##
               PLUS_MINUS
                               WIN
## TEAM_ID
             1.770226e-03 -0.004291493
## YEAR_FOUNDED 2.070646e-02 0.018677760
## SEASON_ID
             -7.611620e-03 -0.002051131
## GAME_ID
             -5.691711e-05 0.001039780
## MIN
             9.593479e-05 -0.001507787
## PTS
             5.098333e-01 0.409020973
## FGM
             4.529707e-01 0.341178143
## FGA
             5.459368e-03 -0.039797933
## FG PCT
             5.401051e-01 0.443240067
             3.169970e-01 0.230102358
## FG3M
## FG3A
             7.260749e-02 0.017417964
## FG3 PCT
             3.873061e-01 0.320473977
## FTM
             1.075001e-01 0.142732309
## FTA
             6.680181e-02 0.113196225
## FT_PCT
             1.207319e-01 0.096915274
## OREB
             -1.489416e-02 -0.033593907
## DREB
             3.987357e-01 0.327944215
## REB
             3.230600e-01
                         0.253577016
## AST
             3.775933e-01 0.286919689
## STL
             1.662939e-01
                        0.136204516
## BLK
             1.831264e-01 0.165842235
## TOV
             -1.238586e-01 -0.107469182
## PF
            -5.163445e-02 -0.104393437
## PLUS MINUS
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## WIN
             8.042013e-01 1.000000000
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