DATA 607 Project 1: Chess Tournament Results

Fan Xu, Sin Ying Wong

9/21/2019

1. Project Description

In this project, you're given a text file with chess tournament results where the information has some structure. Your job is to create an R Markdown file that generates a .CSV file (that could for example be imported into a SQL database) with the following information for all of the players:

Player's Name, Player's State, Total Number of Points, Player's Pre-Rating, and Average Pre Chess Rating of Opponents For the first player, the information would be:

Gary Hua, ON, 6.0, 1794, 1605

1605 was calculated by using the pre-tournament opponents' ratings of 1436, 1563, 1600, 1610, 1649, 1663, 1716, and dividing by the total number of games played.

If you have questions about the meaning of the data or the results, please post them on the discussion forum. Data science, like chess, is a game of back and forth...

The chess rating system (invented by a Minnesota statistician named Arpad Elo) has been used in many other contexts, including assessing relative strength of employment candidates by human resource departments.

You may substitute another text file (or set of text files, or data scraped from web pages) of similar or greater complexity, and create your own assignment and solution. You may work in a small team. All of your code should be in an R markdown file (and published to rpubs.com); with your data accessible for the person running the script.

2. Project Raw Data

The raw data is a text file with unstructured data strings.

```
raw_data <- readLines('https://raw.githubusercontent.com/oggyluky11/DATA607-Project-1/master/tournament
```

```
## Warning in readLines("https://raw.githubusercontent.com/oggyluky11/DATA607-
## Project-1/master/tournamentinfo.txt"): incomplete final line found on
## 'https://raw.githubusercontent.com/oggyluky11/DATA607-Project-1/master/
## tournamentinfo.txt'
```

```
head(raw_data)
```

```
## [1] "-----------------------------------------------------------------------------------------"
## [2] " Pair | Player Name                     |Total|Round|Round|Round|Round|Round|Round|Round| "
## [3] " Num  | USCF ID / Rtg (Pre->Post)       | Pts |  1  |  2  |  3  |  4  |  5  |  6  |  7  | "
## [4] "-----------------------------------------------------------------------------------------"
## [5] "    1 | GARY HUA                        |6.0  |W  39|W  21|W  18|W  14|W   7|D  12|D   4|"
## [6] "   ON | 15445895 / R: 1794   ->1817     |N:2  |W    |B    |W    |B    |W    |B    |W    |"
```

3. Raw Data Manipulation

a. Restructure raw data into dataframe

In raw data, double lines of strings are used to store one 'row' of data. Data columns are seperated by "|". Let's see what this raw data should look like in a real data frame. This step is not requested in this project but it is good to represent the raw data into the way it should look like as data preparation.

```
library(dplyr)
```

```
##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
##     filter, lag

## The following objects are masked from 'package:base':
##
##     intersect, setdiff, setequal, union
```

```
library(tidyr)
library(stringr)
#remove the last character "|"
raw_data <- str_trim(raw_data[str_detect(raw_data,'------')==FALSE],'right')
raw_data <- substr(raw_data, 1 ,nchar(raw_data)-1)

#Combine two lines of data into one row
raw_data2 <- character()
for (i in (1:length(raw_data))) {
  if(i%%2==0) {
    line_odd <- str_trim(unlist(str_split(raw_data[i-1], '\\|')))
    line_even <- str_trim(unlist(str_split(raw_data[i], '\\|')))
    line_cat <- str_c(line_odd,line_even,sep = ' ', collapse = ',')
    raw_data2 <- append(raw_data2,line_cat)
  }
}
raw_data2 <-data.frame(raw_data2)
raw_data_frame <- raw_data2 %>% separate(raw_data2, as.character(c(1:10)), sep = ',', extra = 'drop')

#Set first row as header and rename columns
names(raw_data_frame)<- unlist(raw_data_frame[1,])
raw_data_frame <- raw_data_frame[-1,]
raw_data_frame
```

```
##    Pair Num                    Player Name USCF ID / Rtg (Pre->Post)
## 2      1 ON                     GARY HUA 15445895 / R: 1794   ->1817
## 3      2 MI             DAKSHESH DARURI 14598900 / R: 1553   ->1663
## 4      3 MI                ADITYA BAJAJ 14959604 / R: 1384   ->1640
## 5      4 MI         PATRICK H SCHILLING 12616049 / R: 1716   ->1744
## 6      5 MI                  HANSHI ZUO 14601533 / R: 1655   ->1690
## 7      6 OH                HANSEN SONG 15055204 / R: 1686   ->1687
```

```
## 8      7 MI           GARY DEE SWATHELL 11146376 / R: 1649   ->1673
## 9      8 MI         EZEKIEL HOUGHTON 15142253 / R: 1641P17->1657P24
## 10     9 ON                STEFANO LEE 14954524 / R: 1411   ->1564
## 11    10 MI                  ANVIT RAO 14150362 / R: 1365   ->1544
## 12    11 MI    CAMERON WILLIAM MC LEMAN 12581589 / R: 1712   ->1696
## 13    12 MI             KENNETH J TACK 12681257 / R: 1663   ->1670
## 14    13 MI          TORRANCE HENRY JR 15082995 / R: 1666   ->1662
## 15    14 MI               BRADLEY SHAW 10131499 / R: 1610   ->1618
## 16    15 MI   ZACHARY JAMES HOUGHTON 15619130 / R: 1220P13->1416P20
## 17    16 MI               MIKE NIKITIN 10295068 / R: 1604   ->1613
## 18    17 MI         RONALD GRZEGORCZYK 10297702 / R: 1629   ->1610
## 19    18 MI              DAVID SUNDEEN 11342094 / R: 1600   ->1600
## 20    19 MI               DIPANKAR ROY 14862333 / R: 1564   ->1570
## 21    20 MI                JASON ZHENG 14529060 / R: 1595   ->1569
## 22    21 ON              DINH DANG BUI 15495066 / R: 1563P22->1562
## 23    22 MI            EUGENE L MCCLURE 12405534 / R: 1555   ->1529
## 24    23 ON                   ALAN BUI 15030142 / R: 1363   ->1371
## 25    24 MI           MICHAEL R ALDRICH 13469010 / R: 1229   ->1300
## 26    25 MI            LOREN SCHWIEBERT 12486656 / R: 1745   ->1681
## 27    26 ON                  MAX ZHU 15131520 / R: 1579   ->1564
## 28    27 MI              GAURAV GIDWANI 14476567 / R: 1552   ->1539
## 29    28 MI  SOFIA ADINA STANESCU-BELLU 14882954 / R: 1507   ->1513
## 30    29 MI         CHIEDOZIE OKORIE 15323285 / R: 1602P6 ->1508P12
## 31    30 ON          GEORGE AVERY JONES 12577178 / R: 1522   ->1444
## 32    31 MI               RISHI SHETTY 15131618 / R: 1494   ->1444
## 33    32 ON       JOSHUA PHILIP MATHEWS 14073750 / R: 1441   ->1433
## 34    33 MI                  JADE GE 14691842 / R: 1449   ->1421
## 35    34 MI      MICHAEL JEFFERY THOMAS 15051807 / R: 1399   ->1400
## 36    35 MI            JOSHUA DAVID LEE 14601397 / R: 1438   ->1392
## 37    36 MI              SIDDHARTH JHA 14773163 / R: 1355   ->1367
## 38    37 MI     AMIYATOSH PWNANANDAM 15489571 / R:  980P12->1077P17
## 39    38 MI                  BRIAN LIU 15108523 / R: 1423   ->1439
## 40    39 MI              JOEL R HENDON 12923035 / R: 1436P23->1413
## 41    40 MI               FOREST ZHANG 14892710 / R: 1348   ->1346
## 42    41 MI       KYLE WILLIAM MURPHY 15761443 / R: 1403P5 ->1341P9
## 43    42 MI                  JARED GE 14462326 / R: 1332   ->1256
## 44    43 MI           ROBERT GLEN VASEY 14101068 / R: 1283   ->1244
## 45    44 MI          JUSTIN D SCHILLING 15323504 / R: 1199   ->1199
## 46    45 MI                  DEREK YAN 15372807 / R: 1242   ->1191
## 47    46 MI JACOB ALEXANDER LAVALLEY 15490981 / R:  377P3 ->1076P10
## 48    47 MI                ERIC WRIGHT 12533115 / R: 1362   ->1341
## 49    48 MI               DANIEL KHAIN 14369165 / R: 1382   ->1335
## 50    49 MI         MICHAEL J MARTIN 12531685 / R: 1291P12->1259P17
## 51    50 MI                SHIVAM JHA 14773178 / R: 1056   ->1111
## 52    51 MI             TEJAS AYYAGARI 15205474 / R: 1011   ->1097
## 53    52 MI                  ETHAN GUO 14918803 / R:  935   ->1092
## 54    53 MI              JOSE C YBARRA 12578849 / R: 1393   ->1359
## 55    54 MI               LARRY HODGE 12836773 / R: 1270   ->1200
## 56    55 MI                 ALEX KONG 15412571 / R: 1186   ->1163
## 57    56 MI               MARISA RICCI 14679887 / R: 1153   ->1140
## 58    57 MI                 MICHAEL LU 15113330 / R: 1092   ->1079
## 59    58 MI               VIRAJ MOHILE 14700365 / R:  917   -> 941
## 60    59 MI          SEAN M MC CORMICK 12841036 / R:  853   -> 878
## 61    60 MI                JULIA SHEN 14579262 / R:  967   -> 984
```

```
## 62    61 ON            JEZZEL FARKAS 15771592 / R:  955P11-> 979P18
## 63    62 MI              ASHWIN BALAJI 15219542 / R: 1530   ->1535
## 64    63 MI        THOMAS JOSEPH HOSMER 15057092 / R: 1175   ->1125
## 65    64 MI                    BEN LI 15006561 / R: 1163   ->1112
##    Total Pts Round 1 Round 2 Round 3 Round 4 Round 5 Round 6 Round 7
## 2    6.0 N:2 W  39 W W  21 B W  18 W W  14 B W   7 W D  12 B D   4 W
## 3    6.0 N:2 W  63 B W  58 W L   4 B W  17 W W  16 B W  20 W W   7 B
## 4    6.0 N:2 L   8 W W  61 B W  25 W W  21 B W  11 W W  13 B W  12 W
## 5    5.5 N:2 W  23 W D  28 B W   2 W W  26 B D   5 W W  19 B D   1 B
## 6    5.5 N:2 W  45 B W  37 W D  12 B D  13 W D   4 B W  14 W W  17 B
## 7    5.0 N:3 W  34 W D  29 B L  11 W W  35 B D  10 B W  27 W W  21 B
## 8    5.0 N:3 W  57 W W  46 B W  13 W W  11 B L   1 B W   9 W L   2 W
## 9    5.0 N:3 W   3 B W  32 W L  14 B L   9 W W  47 B W  28 W W  19 W
## 10   5.0 N:2 W  25 W L  18 B W  59 W W   8 B W  26 W L   7 B W  20 B
## 11   5.0 N:3 D  16 W L  19 W W  55 B W  31 B D   6 W W  25 B W  18 W
## 12   4.5 N:3 D  38 B W  56 W W   6 B L   7 W L   3 B W  34 W W  26 B
## 13   4.5 N:3 W  42 W W  33 B D   5 W W  38 B      H  D   1 W L   3 B
## 14   4.5 N:3 W  36 B W  27 W L   7 B D   5 B W  33 W L   3 W W  32 B
## 15   4.5 N:3 W  54 W W  44 B W   8 W L   1 W D  27 B L   5 B W  31 W
## 16   4.5 N:3 D  19 B L  16 B W  30 W L  22 W W  54 B W  33 B W  38 W
## 17   4.0 N:3 D  10 B W  15 W      H  W  39 B L   2 W W  36 B      U
## 18   4.0 N:3 W  48 W W  41 B L  26 W L   2 B W  23 W W  22 B L   5 W
## 19   4.0 N:3 W  47 B W   9 W L   1 B W  32 W L  19 B W  38 W L  10 B
## 20   4.0 N:3 D  15 W W  10 B W  52 W D  28 B W  18 W L   4 W L   8 B
## 21   4.0 N:4 L  40 W W  49 B W  23 W W  41 B W  28 W L   2 B L   9 W
## 22   4.0 N:3 W  43 B L   1 W W  47 B L   3 W W  40 W W  39 B L   6 W
## 23   4.0 N:4 W  64 W D  52 B L  28 W W  15 B      H  L  17 W W  40 B
## 24      4.0  L   4 B W  43 W L  20 B W  58 W L  17 B W  37 W W  46 B
## 25   4.0 N:4 L  28 B L  47 W W  43 B L  25 B W  60 W W  44 W W  39 B
## 26   3.5 N:4 L   9 B W  53 W L   3 B W  24 W D  34 B L  10 W W  47 B
## 27   3.5 N:4 W  49 B W  40 W W  17 B L   4 W L   9 B D  32 W L  11 W
## 28   3.5 N:4 W  51 W L  13 B W  46 W W  37 B D  14 W L   6 B      U
## 29   3.5 N:3 W  24 W D   4 W W  22 B D  19 W L  20 B L   8 B D  36 W
## 30   3.5 N:4 W  50 B D   6 W L  38 B L  34 W W  52 W W  48 B      U
## 31      3.5  L  52 W D  64 B L  15 B W  55 W L  31 W W  61 B W  50 B
## 32      3.5  L  58 B D  55 W W  64 B L  10 W W  30 B W  50 W L  14 B
## 33   3.5 N:4 W  61 W L   8 B W  44 W L  18 B W  51 W D  26 B L  13 W
## 34      3.5  W  60 B L  12 W W  50 B D  36 W L  13 B L  15 W W  51 B
## 35      3.5  L   6 B W  60 W L  37 B W  29 B D  25 W L  11 B W  52 W
## 36      3.5  L  46 W L  38 W W  56 B L   6 W W  57 B D  52 B W  48 W
## 37   3.5 N:4 L  13 W W  57 B W  51 W D  33 B      H  L  16 W D  28 B
## 38      3.5       B  L   5 B W  34 W L  27 W      H  L  23 B W  61 W
## 39   3.0 N:4 D  11 W W  35 B W  29 W L  12 W      H  L  18 B L  15 B
## 40   3.0 N:4 L   1 B W  54 W W  40 B L  16 W W  44 B L  21 W L  24 W
## 41      3.0  W  20 B L  26 B L  39 W W  59 W L  21 B W  56 W L  22 W
## 42      3.0  W  59 B L  17 W W  58 B L  20 W      X       U       U
## 43      3.0  L  12 B L  50 W L  57 B D  60 B D  61 W W  64 W W  56 B
## 44      3.0  L  21 W L  23 B L  24 W W  63 W W  59 B L  46 B W  55 W
## 45      3.0       B  L  14 W L  32 B W  53 B L  39 W L  24 B W  59 W
## 46      3.0  L   5 W L  51 B D  60 W L  56 B W  63 W D  55 B W  58 W
## 47      3.0  W  35 B L   7 W L  27 B L  50 W W  64 B W  43 W L  23 W
## 48      2.5  L  18 W W  24 B L  21 W W  61 B L   8 W D  51 B L  25 W
## 49      2.5  L  17 B W  63 W      H  D  52 B      H  L  29 W L  35 B
## 50      2.5  L  26 W L  20 W D  63 B D  64 W W  58 B      H       U
```

```
## 51      2.5  L  29 W W  42 B L  33 W W  46 B      H  L  31 B L  30 W
## 52      2.5  L  27 B W  45 W L  36 B W  57 W L  32 B D  47 W L  33 W
## 53   2.5 N:4 W  30 B D  22 W L  19 B D  48 W L  29 B D  35 W L  34 B
## 54      2.0       H  L  25 B      H  L  44 W      U  W  57 W      U
## 55      2.0  L  14 B L  39 B L  61 W      B  L  15 W L  59 B W  64 W
## 56      2.0  L  62 W D  31 B L  10 W L  30 B      B  D  45 W L  43 B
## 57      2.0       H  L  11 B L  35 W W  45 W      H  L  40 B L  42 W
## 58      2.0  L   7 B L  36 W W  42 W L  51 B L  35 W L  53 B      B
## 59      2.0  W  31 W L   2 B L  41 W L  23 B L  49 W      B  L  45 B
## 60      2.0  L  41 W      B  L   9 B L  40 B L  43 W W  54 W L  44 B
## 61      1.5  L  33 W L  34 B D  45 B D  42 W L  24 B      H       U
## 62      1.5  L  32 B L   3 W W  54 B L  47 W D  42 B L  30 W L  37 B
## 63      1.0  W  55 B      U       U       U       U       U       U
## 64      1.0  L   2 W L  48 B D  49 W L  43 B L  45 B      H       U
## 65      1.0  L  22 B D  30 W L  31 W D  49 B L  46 W L  42 B L  54 B
```

b. Get data elements

```
data_elements <-data.frame(str_extract(raw_data_frame$`Pair Num`,'\\d+'), #Player's ID
  str_trim(str_extract(raw_data_frame$`Player Name USCF ID / Rtg (Pre->Post)`,'[A-Z ]+\\b')), #Player's
  str_extract(raw_data_frame$`Pair Num`,'[A-Z]+'), #Player's State
  str_extract(raw_data_frame$`Total Pts`,'[0-9.]+'), #Player's Total Points
  str_replace(raw_data_frame$`Player Name USCF ID / Rtg (Pre->Post)`, '[A-z0-9 [:PUNCT:]]+\\/ R\\: *([0
  lapply(raw_data_frame[,4:10], function(x) str_extract(x, '\\d+'))) #IDs of components

#Rename columns
names(data_elements) <- c('ID','Player's Name','Player's State','Total Number of Points','Player's Pre-

#change data type of 'Player's Pre-Rating' to be numberic
data_elements$'Player's Pre-Rating' <- as.numeric(as.character(data_elements$'Player's Pre-Rating'))

#get ratings of all components for each player
data_elements[,6:12] <- data_elements$'Player's Pre-Rating'[match(unlist(data_elements[,6:12]),data_ele

#compute average ratings of components for each player
data_elements$'Average Pre Chess Rating of Opponents' <- round(rowMeans(data_elements[,6:12],na.rm = TR
data_elements
```

```
##    ID            Player's Name Player's State Total Number of Points
## 1   1                GARY HUA             ON                     6.0
## 2   2          DAKSHESH DARURI             MI                     6.0
## 3   3             ADITYA BAJAJ             MI                     6.0
## 4   4      PATRICK H SCHILLING             MI                     5.5
## 5   5               HANSHI ZUO             MI                     5.5
## 6   6              HANSEN SONG             OH                     5.0
## 7   7        GARY DEE SWATHELL             MI                     5.0
## 8   8         EZEKIEL HOUGHTON             MI                     5.0
## 9   9              STEFANO LEE             ON                     5.0
## 10 10                ANVIT RAO             MI                     5.0
## 11 11 CAMERON WILLIAM MC LEMAN             MI                     4.5
## 12 12           KENNETH J TACK             MI                     4.5
## 13 13        TORRANCE HENRY JR             MI                     4.5
```

```
## 14 14             BRADLEY SHAW            MI                   4.5
## 15 15   ZACHARY JAMES HOUGHTON            MI                   4.5
## 16 16             MIKE NIKITIN            MI                   4.0
## 17 17       RONALD GRZEGORCZYK            MI                   4.0
## 18 18            DAVID SUNDEEN            MI                   4.0
## 19 19             DIPANKAR ROY            MI                   4.0
## 20 20              JASON ZHENG            MI                   4.0
## 21 21            DINH DANG BUI            ON                   4.0
## 22 22         EUGENE L MCCLURE            MI                   4.0
## 23 23                 ALAN BUI            ON                   4.0
## 24 24        MICHAEL R ALDRICH            MI                   4.0
## 25 25         LOREN SCHWIEBERT            MI                   3.5
## 26 26                  MAX ZHU            ON                   3.5
## 27 27           GAURAV GIDWANI            MI                   3.5
## 28 28     SOFIA ADINA STANESCU            MI                   3.5
## 29 29         CHIEDOZIE OKORIE            MI                   3.5
## 30 30       GEORGE AVERY JONES            ON                   3.5
## 31 31             RISHI SHETTY            MI                   3.5
## 32 32    JOSHUA PHILIP MATHEWS            ON                   3.5
## 33 33                  JADE GE            MI                   3.5
## 34 34   MICHAEL JEFFERY THOMAS            MI                   3.5
## 35 35         JOSHUA DAVID LEE            MI                   3.5
## 36 36            SIDDHARTH JHA            MI                   3.5
## 37 37     AMIYATOSH PWNANANDAM            MI                   3.5
## 38 38                BRIAN LIU            MI                   3.0
## 39 39            JOEL R HENDON            MI                   3.0
## 40 40             FOREST ZHANG            MI                   3.0
## 41 41      KYLE WILLIAM MURPHY            MI                   3.0
## 42 42                JARED GE            MI                   3.0
## 43 43        ROBERT GLEN VASEY            MI                   3.0
## 44 44       JUSTIN D SCHILLING            MI                   3.0
## 45 45                DEREK YAN            MI                   3.0
## 46 46 JACOB ALEXANDER LAVALLEY            MI                   3.0
## 47 47              ERIC WRIGHT            MI                   2.5
## 48 48             DANIEL KHAIN            MI                   2.5
## 49 49         MICHAEL J MARTIN            MI                   2.5
## 50 50              SHIVAM JHA             MI                   2.5
## 51 51           TEJAS AYYAGARI            MI                   2.5
## 52 52                ETHAN GUO            MI                   2.5
## 53 53            JOSE C YBARRA            MI                   2.0
## 54 54              LARRY HODGE            MI                   2.0
## 55 55                ALEX KONG            MI                   2.0
## 56 56             MARISA RICCI            MI                   2.0
## 57 57               MICHAEL LU            MI                   2.0
## 58 58             VIRAJ MOHILE            MI                   2.0
## 59 59        SEAN M MC CORMICK            MI                   2.0
## 60 60              JULIA SHEN             MI                   1.5
## 61 61            JEZZEL FARKAS            ON                   1.5
## 62 62            ASHWIN BALAJI            MI                   1.0
## 63 63     THOMAS JOSEPH HOSMER            MI                   1.0
## 64 64                  BEN LI              MI                   1.0
##    Player's Pre-Rating Round 1 Round 2 Round 3 Round 4 Round 5 Round 6
## 1                1794    1436    1563    1600    1610    1649    1663
## 2                1553    1175     917    1716    1629    1604    1595
```

```
## 3   1384 1641  955 1745 1563 1712 1666
## 4   1716 1363 1507 1553 1579 1655 1564
## 5   1655 1242  980 1663 1666 1716 1610
## 6   1686 1399 1602 1712 1438 1365 1552
## 7   1649 1092  377 1666 1712 1794 1411
## 8   1641 1384 1441 1610 1411 1362 1507
## 9   1411 1745 1600  853 1641 1579 1649
## 10  1365 1604 1564 1186 1494 1686 1745
## 11  1712 1423 1153 1686 1649 1384 1399
## 12  1663 1332 1449 1655 1423   NA 1794
## 13  1666 1355 1552 1649 1655 1449 1384
## 14  1610 1270 1199 1641 1794 1552 1655
## 15  1220 1564 1604 1522 1555 1270 1449
## 16  1604 1365 1220   NA 1436 1553 1355
## 17  1629 1382 1403 1579 1553 1363 1555
## 18  1600 1362 1411 1794 1441 1564 1423
## 19  1564 1220 1365  935 1507 1600 1716
## 20  1595 1348 1291 1363 1403 1507 1553
## 21  1563 1283 1794 1362 1384 1348 1436
## 22  1555 1163  935 1507 1220   NA 1629
## 23  1363 1716 1283 1595  917 1629  980
## 24  1229 1507 1362 1283 1745  967 1199
## 25  1745 1411 1393 1384 1229 1399 1365
## 26  1579 1291 1348 1629 1716 1411 1441
## 27  1552 1011 1666  377  980 1610 1686
## 28  1507 1229 1716 1555 1564 1595 1641
## 29  1602 1056 1686 1423 1399  935 1382
## 30  1522  935 1163 1220 1186 1494  955
## 31  1494  917 1186 1163 1365 1522 1056
## 32  1441  955 1641 1199 1600 1011 1579
## 33  1449  967 1663 1056 1355 1666 1220
## 34  1399 1686  967  980 1602 1745 1712
## 35  1438  377 1423 1153 1686 1092  935
## 36  1355 1666 1092 1011 1449   NA 1604
## 37   980   NA 1655 1399 1552   NA 1363
## 38  1423 1712 1438 1602 1663   NA 1600
## 39  1436 1794 1270 1348 1604 1199 1563
## 40  1348 1595 1579 1436  853 1563 1153
## 41  1403  853 1629  917 1595   NA   NA
## 42  1332 1663 1056 1092  967  955 1163
## 43  1283 1563 1363 1229 1175  853  377
## 44  1199   NA 1610 1441 1393 1436 1229
## 45  1242 1655 1011  967 1153 1175 1186
## 46   377 1438 1649 1552 1056 1163 1283
## 47  1362 1600 1229 1563  955 1641 1011
## 48  1382 1629 1175   NA  935   NA 1602
## 49  1291 1579 1595 1175 1163  917   NA
## 50  1056 1602 1332 1449  377   NA 1494
## 51  1011 1552 1242 1355 1092 1441 1362
## 52   935 1522 1555 1564 1382 1602 1438
## 53  1393   NA 1745   NA 1199   NA 1092
## 54  1270 1610 1436  955   NA 1220  853
## 55  1186 1530 1494 1365 1522   NA 1242
## 56  1153   NA 1712 1438 1242   NA 1348
```

```
## 57                1092    1649    1355    1332    1011    1438    1393
## 58                 917    1494    1553    1403    1363    1291      NA
## 59                 853    1403      NA    1411    1348    1283    1270
## 60                 967    1449    1399    1242    1332    1229      NA
## 61                 955    1441    1384    1270    1362    1332    1522
## 62                1530    1186      NA      NA      NA      NA      NA
## 63                1175    1553    1382    1291    1283    1242      NA
## 64                1163    1555    1522    1494    1291     377    1332
##    Round 7 Average Pre Chess Rating of Opponents
## 1     1716                                 1605
## 2     1649                                 1469
## 3     1663                                 1564
## 4     1794                                 1574
## 5     1629                                 1501
## 6     1563                                 1519
## 7     1553                                 1372
## 8     1564                                 1468
## 9     1595                                 1523
## 10    1600                                 1554
## 11    1579                                 1468
## 12    1384                                 1506
## 13    1441                                 1498
## 14    1494                                 1515
## 15    1423                                 1484
## 16      NA                                 1386
## 17    1655                                 1499
## 18    1365                                 1480
## 19    1641                                 1426
## 20    1411                                 1411
## 21    1686                                 1470
## 22    1348                                 1300
## 23     377                                 1214
## 24    1436                                 1357
## 25    1362                                 1363
## 26    1712                                 1507
## 27      NA                                 1222
## 28    1355                                 1522
## 29      NA                                 1314
## 30    1056                                 1144
## 31    1610                                 1260
## 32    1666                                 1379
## 33    1011                                 1277
## 34     935                                 1375
## 35    1382                                 1150
## 36    1507                                 1388
## 37     955                                 1385
## 38    1220                                 1539
## 39    1229                                 1430
## 40    1555                                 1391
## 41      NA                                 1248
## 42    1153                                 1150
## 43    1186                                 1107
## 44     853                                 1327
## 45     917                                 1152
```

```
## 46    1363                                1358
## 47    1745                                1392
## 48    1438                                1356
## 49      NA                                1286
## 50    1522                                1296
## 51    1449                                1356
## 52    1399                                1495
## 53      NA                                1345
## 54    1163                                1206
## 55    1283                                1406
## 56    1332                                1414
## 57      NA                                1363
## 58    1242                                1391
## 59    1199                                1319
## 60      NA                                1330
## 61     980                                1327
## 62      NA                                1186
## 63      NA                                1350
## 64    1270                                1263
```

3. Present final data

```
final_data <- subset(data_elements[,c(2:5,13)])
final_data
```

```
##               Player's Name Player's State Total Number of Points
## 1                  GARY HUA             ON                    6.0
## 2            DAKSHESH DARURI             MI                    6.0
## 3               ADITYA BAJAJ             MI                    6.0
## 4         PATRICK H SCHILLING             MI                    5.5
## 5                 HANSHI ZUO             MI                    5.5
## 6                HANSEN SONG             OH                    5.0
## 7          GARY DEE SWATHELL             MI                    5.0
## 8           EZEKIEL HOUGHTON             MI                    5.0
## 9                STEFANO LEE             ON                    5.0
## 10                 ANVIT RAO             MI                    5.0
## 11 CAMERON WILLIAM MC LEMAN             MI                    4.5
## 12            KENNETH J TACK             MI                    4.5
## 13         TORRANCE HENRY JR             MI                    4.5
## 14              BRADLEY SHAW             MI                    4.5
## 15   ZACHARY JAMES HOUGHTON             MI                    4.5
## 16              MIKE NIKITIN             MI                    4.0
## 17        RONALD GRZEGORCZYK             MI                    4.0
## 18             DAVID SUNDEEN             MI                    4.0
## 19              DIPANKAR ROY             MI                    4.0
## 20               JASON ZHENG             MI                    4.0
## 21             DINH DANG BUI             ON                    4.0
## 22          EUGENE L MCCLURE             MI                    4.0
## 23                  ALAN BUI             ON                    4.0
## 24         MICHAEL R ALDRICH             MI                    4.0
## 25          LOREN SCHWIEBERT             MI                    3.5
```

```
## 26                 MAX ZHU            ON                  3.5
## 27           GAURAV GIDWANI            MI                  3.5
## 28     SOFIA ADINA STANESCU            MI                  3.5
## 29         CHIEDOZIE OKORIE            MI                  3.5
## 30       GEORGE AVERY JONES            ON                  3.5
## 31             RISHI SHETTY            MI                  3.5
## 32    JOSHUA PHILIP MATHEWS            ON                  3.5
## 33                 JADE GE            MI                  3.5
## 34   MICHAEL JEFFERY THOMAS            MI                  3.5
## 35         JOSHUA DAVID LEE            MI                  3.5
## 36            SIDDHARTH JHA            MI                  3.5
## 37     AMIYATOSH PWNANANDAM            MI                  3.5
## 38               BRIAN LIU             MI                  3.0
## 39            JOEL R HENDON            MI                  3.0
## 40             FOREST ZHANG            MI                  3.0
## 41      KYLE WILLIAM MURPHY            MI                  3.0
## 42                 JARED GE            MI                  3.0
## 43        ROBERT GLEN VASEY            MI                  3.0
## 44       JUSTIN D SCHILLING            MI                  3.0
## 45               DEREK YAN             MI                  3.0
## 46 JACOB ALEXANDER LAVALLEY            MI                  3.0
## 47              ERIC WRIGHT            MI                  2.5
## 48             DANIEL KHAIN            MI                  2.5
## 49         MICHAEL J MARTIN            MI                  2.5
## 50               SHIVAM JHA            MI                  2.5
## 51           TEJAS AYYAGARI            MI                  2.5
## 52               ETHAN GUO             MI                  2.5
## 53            JOSE C YBARRA            MI                  2.0
## 54              LARRY HODGE            MI                  2.0
## 55                ALEX KONG            MI                  2.0
## 56             MARISA RICCI            MI                  2.0
## 57               MICHAEL LU            MI                  2.0
## 58             VIRAJ MOHILE            MI                  2.0
## 59       SEAN M MC CORMICK             MI                  2.0
## 60               JULIA SHEN            MI                  1.5
## 61            JEZZEL FARKAS            ON                  1.5
## 62            ASHWIN BALAJI            MI                  1.0
## 63     THOMAS JOSEPH HOSMER            MI                  1.0
## 64                   BEN LI            MI                  1.0
##    Player's Pre-Rating Average Pre Chess Rating of Opponents
## 1                 1794                                1605
## 2                 1553                                1469
## 3                 1384                                1564
## 4                 1716                                1574
## 5                 1655                                1501
## 6                 1686                                1519
## 7                 1649                                1372
## 8                 1641                                1468
## 9                 1411                                1523
## 10                1365                                1554
## 11                1712                                1468
## 12                1663                                1506
## 13                1666                                1498
## 14                1610                                1515
```

```
## 15  1220  1484
## 16  1604  1386
## 17  1629  1499
## 18  1600  1480
## 19  1564  1426
## 20  1595  1411
## 21  1563  1470
## 22  1555  1300
## 23  1363  1214
## 24  1229  1357
## 25  1745  1363
## 26  1579  1507
## 27  1552  1222
## 28  1507  1522
## 29  1602  1314
## 30  1522  1144
## 31  1494  1260
## 32  1441  1379
## 33  1449  1277
## 34  1399  1375
## 35  1438  1150
## 36  1355  1388
## 37   980  1385
## 38  1423  1539
## 39  1436  1430
## 40  1348  1391
## 41  1403  1248
## 42  1332  1150
## 43  1283  1107
## 44  1199  1327
## 45  1242  1152
## 46   377  1358
## 47  1362  1392
## 48  1382  1356
## 49  1291  1286
## 50  1056  1296
## 51  1011  1356
## 52   935  1495
## 53  1393  1345
## 54  1270  1206
## 55  1186  1406
## 56  1153  1414
## 57  1092  1363
## 58   917  1391
## 59   853  1319
## 60   967  1330
## 61   955  1327
## 62  1530  1186
## 63  1175  1350
## 64  1163  1263
```

4. Save Final Data as CSV

```
write.csv(final_data, 'Final_data.csv', row.names = FALSE)

# Let's check the csv output, looks good:)
read.csv('Final_data.csv')
```

```
##               Player.s.Name Player.s.State Total.Number.of.Points
## 1                 GARY HUA             ON                     6.0
## 2           DAKSHESH DARURI             MI                     6.0
## 3              ADITYA BAJAJ             MI                     6.0
## 4       PATRICK H SCHILLING             MI                     5.5
## 5                HANSHI ZUO             MI                     5.5
## 6              HANSEN SONG              OH                     5.0
## 7         GARY DEE SWATHELL             MI                     5.0
## 8          EZEKIEL HOUGHTON             MI                     5.0
## 9               STEFANO LEE             ON                     5.0
## 10                ANVIT RAO             MI                     5.0
## 11 CAMERON WILLIAM MC LEMAN             MI                     4.5
## 12           KENNETH J TACK             MI                     4.5
## 13        TORRANCE HENRY JR             MI                     4.5
## 14             BRADLEY SHAW             MI                     4.5
## 15   ZACHARY JAMES HOUGHTON             MI                     4.5
## 16             MIKE NIKITIN             MI                     4.0
## 17       RONALD GRZEGORCZYK             MI                     4.0
## 18            DAVID SUNDEEN             MI                     4.0
## 19             DIPANKAR ROY             MI                     4.0
## 20              JASON ZHENG             MI                     4.0
## 21            DINH DANG BUI             ON                     4.0
## 22         EUGENE L MCCLURE             MI                     4.0
## 23                 ALAN BUI             ON                     4.0
## 24        MICHAEL R ALDRICH             MI                     4.0
## 25         LOREN SCHWIEBERT             MI                     3.5
## 26                  MAX ZHU             ON                     3.5
## 27           GAURAV GIDWANI             MI                     3.5
## 28     SOFIA ADINA STANESCU             MI                     3.5
## 29         CHIEDOZIE OKORIE             MI                     3.5
## 30       GEORGE AVERY JONES             ON                     3.5
## 31             RISHI SHETTY             MI                     3.5
## 32    JOSHUA PHILIP MATHEWS             ON                     3.5
## 33                 JADE GE              MI                     3.5
## 34   MICHAEL JEFFERY THOMAS             MI                     3.5
## 35         JOSHUA DAVID LEE             MI                     3.5
## 36            SIDDHARTH JHA             MI                     3.5
## 37     AMIYATOSH PWNANANDAM             MI                     3.5
## 38                BRIAN LIU             MI                     3.0
## 39            JOEL R HENDON             MI                     3.0
## 40             FOREST ZHANG             MI                     3.0
## 41      KYLE WILLIAM MURPHY             MI                     3.0
## 42                 JARED GE             MI                     3.0
## 43        ROBERT GLEN VASEY             MI                     3.0
## 44       JUSTIN D SCHILLING             MI                     3.0
```

```
## 45                DEREK YAN            MI                    3.0
## 46 JACOB ALEXANDER LAVALLEY            MI                    3.0
## 47              ERIC WRIGHT            MI                    2.5
## 48             DANIEL KHAIN            MI                    2.5
## 49         MICHAEL J MARTIN            MI                    2.5
## 50               SHIVAM JHA            MI                    2.5
## 51           TEJAS AYYAGARI            MI                    2.5
## 52                ETHAN GUO            MI                    2.5
## 53            JOSE C YBARRA            MI                    2.0
## 54              LARRY HODGE            MI                    2.0
## 55                ALEX KONG            MI                    2.0
## 56             MARISA RICCI            MI                    2.0
## 57               MICHAEL LU            MI                    2.0
## 58             VIRAJ MOHILE            MI                    2.0
## 59        SEAN M MC CORMICK            MI                    2.0
## 60                JULIA SHEN            MI                    1.5
## 61            JEZZEL FARKAS            ON                    1.5
## 62            ASHWIN BALAJI            MI                    1.0
## 63     THOMAS JOSEPH HOSMER            MI                    1.0
## 64                   BEN LI            MI                    1.0
##    Player.s.Pre.Rating Average.Pre.Chess.Rating.of.Opponents
## 1                 1794                                 1605
## 2                 1553                                 1469
## 3                 1384                                 1564
## 4                 1716                                 1574
## 5                 1655                                 1501
## 6                 1686                                 1519
## 7                 1649                                 1372
## 8                 1641                                 1468
## 9                 1411                                 1523
## 10                1365                                 1554
## 11                1712                                 1468
## 12                1663                                 1506
## 13                1666                                 1498
## 14                1610                                 1515
## 15                1220                                 1484
## 16                1604                                 1386
## 17                1629                                 1499
## 18                1600                                 1480
## 19                1564                                 1426
## 20                1595                                 1411
## 21                1563                                 1470
## 22                1555                                 1300
## 23                1363                                 1214
## 24                1229                                 1357
## 25                1745                                 1363
## 26                1579                                 1507
## 27                1552                                 1222
## 28                1507                                 1522
## 29                1602                                 1314
## 30                1522                                 1144
## 31                1494                                 1260
## 32                1441                                 1379
## 33                1449                                 1277
```

```
## 34                1399                                1375
## 35                1438                                1150
## 36                1355                                1388
## 37                 980                                1385
## 38                1423                                1539
## 39                1436                                1430
## 40                1348                                1391
## 41                1403                                1248
## 42                1332                                1150
## 43                1283                                1107
## 44                1199                                1327
## 45                1242                                1152
## 46                 377                                1358
## 47                1362                                1392
## 48                1382                                1356
## 49                1291                                1286
## 50                1056                                1296
## 51                1011                                1356
## 52                 935                                1495
## 53                1393                                1345
## 54                1270                                1206
## 55                1186                                1406
## 56                1153                                1414
## 57                1092                                1363
## 58                 917                                1391
## 59                 853                                1319
## 60                 967                                1330
## 61                 955                                1327
## 62                1530                                1186
## 63                1175                                1350
## 64                1163                                1263
```

5. Extra Data Analysis

It is fun and challenge in a chess tournament where players are paried according to a certain rating algorithm which matches players with compatible components, which means if a player has high winning rate, he/she will be more likely to paired with a strong component in the next run. Let's see if this is the case in this data set.

```
library(reshape2)
```

```
##
## Attaching package: 'reshape2'
```

```
## The following object is masked from 'package:tidyr':
##
##     smiths
```

```
# extract a new subset of data which records results of each round, then compute the wining-rate of eac
data <- data.frame(lapply(raw_data_frame[,c(2,4:10)], function(x) str_trim(str_extract(str_trim(x),'^[A
```

```r
# For a more accurate winning-rate, in this data set only players who completed all 7 rounds of game ar
data <-na.omit(data)
names(data)<-c('Name', str_c('Round_', c(1:7)))
data
```

```
##                         Name Round_1 Round_2 Round_3 Round_4 Round_5
## 1                   GARY HUA       W       W       W       W       W
## 2             DAKSHESH DARURI       W       W       L       W       W
## 3                ADITYA BAJAJ       L       W       W       W       W
## 4         PATRICK H SCHILLING       W       D       W       W       D
## 5                  HANSHI ZUO       W       W       D       D       D
## 6                HANSEN SONG       W       D       L       W       D
## 7           GARY DEE SWATHELL       W       W       W       W       L
## 8            EZEKIEL HOUGHTON       W       W       L       L       W
## 9                 STEFANO LEE       W       L       W       W       W
## 10                  ANVIT RAO       D       L       W       W       D
## 11 CAMERON WILLIAM MC LEMAN       D       W       W       L       L
## 13          TORRANCE HENRY JR       W       W       L       D       W
## 14               BRADLEY SHAW       W       W       W       L       D
## 15    ZACHARY JAMES HOUGHTON       D       L       W       L       W
## 17        RONALD GRZEGORCZYK       W       W       L       L       W
## 18             DAVID SUNDEEN       W       W       L       W       L
## 19              DIPANKAR ROY       D       W       W       D       W
## 20                JASON ZHENG       L       W       W       W       W
## 21             DINH DANG BUI       W       L       W       L       W
## 23                   ALAN BUI       L       W       L       W       L
## 24          MICHAEL R ALDRICH       L       L       W       L       W
## 25           LOREN SCHWIEBERT       L       W       L       W       D
## 26                    MAX ZHU       W       W       W       L       L
## 28      SOFIA ADINA STANESCU       W       D       W       D       L
## 30        GEORGE AVERY JONES       L       D       L       W       L
## 31               RISHI SHETTY       L       D       W       L       W
## 32     JOSHUA PHILIP MATHEWS       W       L       W       L       W
## 33                    JADE GE       W       L       W       D       L
## 34    MICHAEL JEFFERY THOMAS       L       W       L       W       D
## 35          JOSHUA DAVID LEE       L       L       W       L       W
## 39             JOEL R HENDON       L       W       W       L       W
## 40              FOREST ZHANG       W       L       L       W       L
## 42                  JARED GE       L       L       L       D       D
## 43         ROBERT GLEN VASEY       L       L       L       W       W
## 45                 DEREK YAN       L       L       D       L       W
## 46 JACOB ALEXANDER LAVALLEY       W       L       L       L       W
## 47               ERIC WRIGHT       L       W       L       W       L
## 51            TEJAS AYYAGARI       L       W       L       W       L
## 52                 ETHAN GUO       W       D       L       D       L
## 61             JEZZEL FARKAS       L       L       W       L       D
## 64                   BEN LI       L       D       L       D       L
##    Round_6 Round_7
## 1        D       D
## 2        W       W
## 3        W       W
## 4        W       D
## 5        W       W
## 6        W       W
```

```
## 7        W       L
## 8        W       W
## 9        L       W
## 10       W       W
## 11       W       W
## 13       L       W
## 14       L       W
## 15       W       W
## 17       W       L
## 18       W       L
## 19       L       L
## 20       L       L
## 21       W       L
## 23       W       W
## 24       W       W
## 25       L       W
## 26       D       L
## 28       L       D
## 30       W       W
## 31       W       L
## 32       D       L
## 33       L       W
## 34       L       W
## 35       D       W
## 39       L       L
## 40       W       L
## 42       W       W
## 43       L       W
## 45       D       W
## 46       W       L
## 47       D       L
## 51       D       L
## 52       D       L
## 61       L       L
## 64       L       L
```

```
# Reshape the data and compute winning-rate
data_melt <- melt(data, variable.name = 'Round', value.name = 'Result', id.vars = c('Name'))
data_cast <- dcast(data_melt, Name~Result, fun.aggregate = length)
```

```
## Using Result as value column: use value.var to override.
```

```
data_cast$Win_Rtg <-data_cast$W/7

# Join the final_data set in previous section
data_join <-merge(data_cast,final_data,by.x=c('Name'),by.y=c('Player's Name'))
data_join$Rtg_Diff <- data_join[,9]-data_join[,8]
data_join$Win_Seg <-ifelse(data_join$Win_Rtg>=0.5, 'Winning_Rate >= 50%', 'Winning_Rate < 50%')
data_join
```

```
##                       Name D L W   Win_Rtg Player's State
## 1             ADITYA BAJAJ 0 1 6 0.8571429             MI
## 2                 ALAN BUI 0 3 4 0.5714286             ON
```

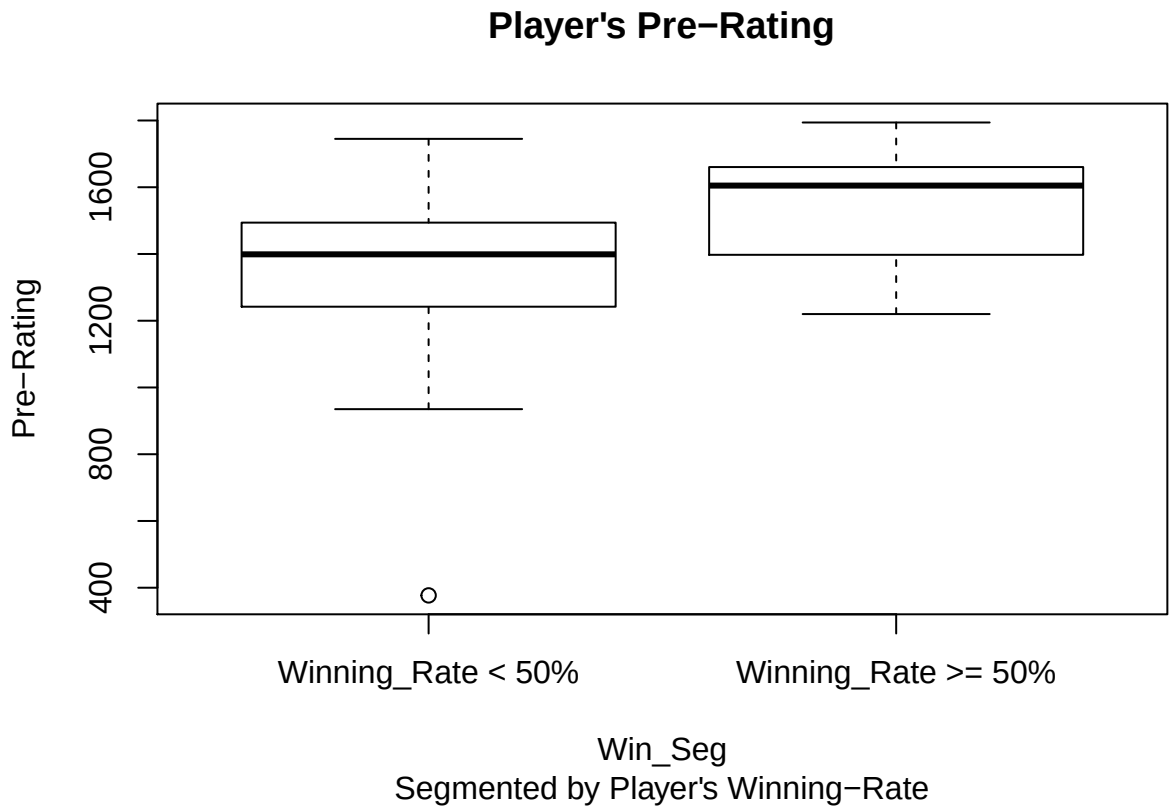
```
## 3                 ANVIT RAO 2 1 4 0.5714286            MI
## 4                   BEN LI 2 5 0 0.0000000            MI
## 5              BRADLEY SHAW 1 2 4 0.5714286            MI
## 6  CAMERON WILLIAM MC LEMAN 1 2 4 0.5714286            MI
## 7           DAKSHESH DARURI 0 1 6 0.8571429            MI
## 8             DAVID SUNDEEN 0 3 4 0.5714286            MI
## 9                 DEREK YAN 2 3 2 0.2857143            MI
## 10            DINH DANG BUI 0 3 4 0.5714286            ON
## 11             DIPANKAR ROY 2 2 3 0.4285714            MI
## 12              ERIC WRIGHT 1 4 2 0.2857143            MI
## 13                ETHAN GUO 3 3 1 0.1428571            MI
## 14         EZEKIEL HOUGHTON 0 2 5 0.7142857            MI
## 15             FOREST ZHANG 0 4 3 0.4285714            MI
## 16        GARY DEE SWATHELL 0 2 5 0.7142857            MI
## 17                GARY HUA 2 0 5 0.7142857            ON
## 18       GEORGE AVERY JONES 1 3 3 0.4285714            ON
## 19              HANSEN SONG 2 1 4 0.5714286            OH
## 20               HANSHI ZUO 3 0 4 0.5714286            MI
## 21 JACOB ALEXANDER LAVALLEY 0 4 3 0.4285714            MI
## 22                  JADE GE 1 3 3 0.4285714            MI
## 23                JARED GE 2 3 2 0.2857143            MI
## 24              JASON ZHENG 0 3 4 0.5714286            MI
## 25            JEZZEL FARKAS 1 5 1 0.1428571            ON
## 26            JOEL R HENDON 0 4 3 0.4285714            MI
## 27         JOSHUA DAVID LEE 1 3 3 0.4285714            MI
## 28    JOSHUA PHILIP MATHEWS 1 3 3 0.4285714            ON
## 29         LOREN SCHWIEBERT 1 3 3 0.4285714            MI
## 30                 MAX ZHU 1 3 3 0.4285714            ON
## 31   MICHAEL JEFFERY THOMAS 1 3 3 0.4285714            MI
## 32        MICHAEL R ALDRICH 0 3 4 0.5714286            MI
## 33     PATRICK H SCHILLING 3 0 4 0.5714286            MI
## 34             RISHI SHETTY 1 3 3 0.4285714            MI
## 35        ROBERT GLEN VASEY 0 4 3 0.4285714            MI
## 36       RONALD GRZEGORCZYK 0 3 4 0.5714286            MI
## 37     SOFIA ADINA STANESCU 3 2 2 0.2857143            MI
## 38              STEFANO LEE 0 2 5 0.7142857            ON
## 39           TEJAS AYYAGARI 1 4 2 0.2857143            MI
## 40        TORRANCE HENRY JR 1 2 4 0.5714286            MI
## 41   ZACHARY JAMES HOUGHTON 1 2 4 0.5714286            MI
##    Total Number of Points Player's Pre-Rating
## 1                     6.0                1384
## 2                     4.0                1363
## 3                     5.0                1365
## 4                     1.0                1163
## 5                     4.5                1610
## 6                     4.5                1712
## 7                     6.0                1553
## 8                     4.0                1600
## 9                     3.0                1242
## 10                    4.0                1563
## 11                    4.0                1564
## 12                    2.5                1362
## 13                    2.5                 935
## 14                    5.0                1641
```

```
## 15                    3.0                1348
## 16                    5.0                1649
## 17                    6.0                1794
## 18                    3.5                1522
## 19                    5.0                1686
## 20                    5.5                1655
## 21                    3.0                 377
## 22                    3.5                1449
## 23                    3.0                1332
## 24                    4.0                1595
## 25                    1.5                 955
## 26                    3.0                1436
## 27                    3.5                1438
## 28                    3.5                1441
## 29                    3.5                1745
## 30                    3.5                1579
## 31                    3.5                1399
## 32                    4.0                1229
## 33                    5.5                1716
## 34                    3.5                1494
## 35                    3.0                1283
## 36                    4.0                1629
## 37                    3.5                1507
## 38                    5.0                1411
## 39                    2.5                1011
## 40                    4.5                1666
## 41                    4.5                1220
##    Average Pre Chess Rating of Opponents Rtg_Diff             Win_Seg
## 1                                   1564      180 Winning_Rate >= 50%
## 2                                   1214     -149 Winning_Rate >= 50%
## 3                                   1554      189 Winning_Rate >= 50%
## 4                                   1263      100  Winning_Rate < 50%
## 5                                   1515      -95 Winning_Rate >= 50%
## 6                                   1468     -244 Winning_Rate >= 50%
## 7                                   1469      -84 Winning_Rate >= 50%
## 8                                   1480     -120 Winning_Rate >= 50%
## 9                                   1152      -90  Winning_Rate < 50%
## 10                                  1470      -93 Winning_Rate >= 50%
## 11                                  1426     -138  Winning_Rate < 50%
## 12                                  1392       30  Winning_Rate < 50%
## 13                                  1495      560  Winning_Rate < 50%
## 14                                  1468     -173 Winning_Rate >= 50%
## 15                                  1391       43  Winning_Rate < 50%
## 16                                  1372     -277 Winning_Rate >= 50%
## 17                                  1605     -189 Winning_Rate >= 50%
## 18                                  1144     -378  Winning_Rate < 50%
## 19                                  1519     -167 Winning_Rate >= 50%
## 20                                  1501     -154 Winning_Rate >= 50%
## 21                                  1358      981  Winning_Rate < 50%
## 22                                  1277     -172  Winning_Rate < 50%
## 23                                  1150     -182  Winning_Rate < 50%
## 24                                  1411     -184 Winning_Rate >= 50%
## 25                                  1327      372  Winning_Rate < 50%
## 26                                  1430       -6  Winning_Rate < 50%
```

```
## 27                                1150     -288  Winning_Rate < 50%
## 28                                1379      -62  Winning_Rate < 50%
## 29                                1363     -382  Winning_Rate < 50%
## 30                                1507      -72  Winning_Rate < 50%
## 31                                1375      -24  Winning_Rate < 50%
## 32                                1357      128 Winning_Rate >= 50%
## 33                                1574     -142 Winning_Rate >= 50%
## 34                                1260     -234  Winning_Rate < 50%
## 35                                1107     -176  Winning_Rate < 50%
## 36                                1499     -130 Winning_Rate >= 50%
## 37                                1522       15  Winning_Rate < 50%
## 38                                1523      112 Winning_Rate >= 50%
## 39                                1356      345  Winning_Rate < 50%
## 40                                1498     -168 Winning_Rate >= 50%
## 41                                1484      264 Winning_Rate >= 50%
```

A player who has high wining rate always has high rating. This can be shown in the boxplot below.

```
boxplot(data_join$"Player's Pre-Rating"~Win_Seg, data=data_join, main="Player's Pre-Rating",
        sub="Segmented by Player's Winning-Rate", ylab = 'Pre-Rating')
```



The second boxplot below shows that players with low winning rates have wider range of components in terms of the rating of components, while players with high wining rates are more likely to be paired components with equal or close ratings. combine with the observation in the first boxplot above, players with high wining rates always have higher ratings, we can see that the more games the player win, the higher his/her rating is, and the more likely he/she will pair with components of similar high level.

```r
boxplot(Rtg_Diff~Win_Seg, data=data_join,
        main="Difference between Average Rating of Components and Player's Rating",
        sub="Segmented by Player's Winning-Rate", ylab = 'Rating-Difference')
```