Final_Project - Chess Dataset

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```
chess<-read.csv(file = 'games.csv')</pre>
head(chess)
           id rated created_at last_move_at turns victory_status winner
## 1 TZJHLljE FALSE 1.50421e+12 1.50421e+12
                                                         outoftime
                                                                    white
## 2 11NXvwaE TRUE 1.50413e+12 1.50413e+12
                                                 16
                                                            resign
                                                                    black
## 3 mIICvQHh TRUE 1.50413e+12 1.50413e+12
                                                 61
                                                              mate
                                                                    white
## 4 kWKvrqYL TRUE 1.50411e+12 1.50411e+12
                                                              mate
                                                                    white
## 5 9tXo1AUZ TRUE 1.50403e+12 1.50403e+12
                                                95
                                                              mate
                                                                    white
## 6 MsoDV9wj FALSE 1.50424e+12 1.50424e+12
                                                 5
                                                              draw
                                                                     draw
     increment_code
                         white_id white_rating
                                                     black_id black_rating
## 1
               15+2
                         bourgris
                                          1500
                                                         a-00
                                                                      1191
               5+10
## 2
                             a-00
                                          1322
                                                                      1261
                                                    skinnerua
                                                         a-00
## 3
               5+10
                           ischia
                                          1496
                                                                      1500
## 4
               20+0 daniamurashov
                                          1439 adivanov2009
                                                                      1454
                        nik221107
               30+3
                                          1523 adivanov2009
                                                                      1469
## 6
               10+0
                        trelynn17
                                          1250 franklin14532
                                                                      1002
##
## 1
## 2
## 3
## 5 e4 e5 Nf3 d6 d4 Nc6 d5 Nb4 a3 Na6 Nc3 Be7 b4 Nf6 Bg5 0-0 b5 Nc5 Bxf6 Bxf6 Bd3 Qd7 0-0 Nxd3 Qxd3 c6
## 6
     opening_eco
                                            opening_name opening_ply
## 1
            D10
                       Slav Defense: Exchange Variation
             BOO Nimzowitsch Defense: Kennedy Variation
## 3
             C20 King's Pawn Game: Leonardis Variation
                                                                   3
## 4
             DO2 Queen's Pawn Game: Zukertort Variation
                                                                   3
## 5
             C41
                                       Philidor Defense
                   Sicilian Defense: Mongoose Variation
names(chess)
   [1] "id"
##
                         "rated"
                                           "created_at"
                                                            "last_move_at"
   [5] "turns"
                                                            "increment_code"
                         "victory_status" "winner"
  [9] "white id"
                         "white_rating"
                                                            "black_rating"
                                           "black_id"
                                                            "opening_ply"
## [13] "moves"
                         "opening_eco"
                                           "opening_name"
str(chess)
## 'data.frame':
                    20058 obs. of 16 variables:
                    : chr "TZJHLljE" "l1NXvwaE" "mIICvQHh" "kWKvrqYL" ...
## $ id
```

: chr "FALSE" "TRUE" "TRUE" "TRUE" ...

\$ rated

```
1.5e+12 1.5e+12 1.5e+12 1.5e+12 1.5e+12 ...
   $ created at
                    : num
##
   $ last move at
                           1.5e+12 1.5e+12 1.5e+12 1.5e+12 1.5e+12 ...
                    : num
                           13 16 61 61 95 5 33 9 66 119 ...
##
                    : int
                           "outoftime" "resign" "mate" "mate" ...
##
   $ victory_status: chr
##
   $ winner
                    : chr
                            "white" "black" "white" "white"
                           "15+2" "5+10" "5+10" "20+0" ...
##
   $ increment code: chr
                            "bourgris" "a-00" "ischia" "daniamurashov" ...
##
   $ white id
                    : chr
                           1500 1322 1496 1439 1523 1250 1520 1413 1439 1381 ...
##
    $ white_rating
                    : int
##
   $ black id
                    : chr
                            "a-00" "skinnerua" "a-00" "adivanov2009" ...
                           1191 1261 1500 1454 1469 1002 1423 2108 1392 1209 ...
##
   $ black_rating
                    : int
                            "d4 d5 c4 c6 cxd5 e6 dxe6 fxe6 Nf3 Bb4+ Nc3 Ba5 Bf4" "d4 Nc6 e4 e5 f4 f6 dxe
##
   $ moves
                    : chr
                           "D10" "B00" "C20" "D02" ...
   $ opening_eco
##
                    : chr
   $ opening_name
                    : chr
                           "Slav Defense: Exchange Variation" "Nimzowitsch Defense: Kennedy Variation"
   $ opening_ply
                           5 4 3 3 5 4 10 5 6 4 ...
                    : int
```

Dataset Explain

This dataset contains all games on lichess both rated and non-rated games. Also, it haves every game who wins who losses and drew. Plus, it also have every move in the game. There are 20058 observations and 17 variables inside of this dataset.

Why this dataset is interest to me

I start playing chess when I was 12 years old, which means I have played more than 9 years of chess. During this 9 years stretch, I have win more than 50 trophies and medals. It is one of my hobbies. Back in high school, I have started a chess club, which gave me another 2 hours to play chess. Also when I play chess, my brain will become more focus, which helps me easier to think what move should I make. I'm once a candidate master back in my country. My rating is around 2100, which is around 92 percentile on lichess.com.

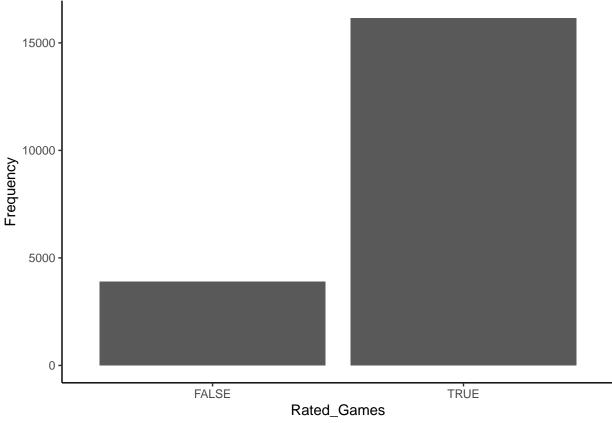
GM Hikaru

GM Hikaru once said that "I fear not the man who has practiced 10,000 openings once, but I fear the man who has practiced one opening 10,000 times" GM Hikaru once the world 2nd in chess ranking. ## State The Problem I will focus on Which opening has the highest winning percentage for both white and black.

Step 1

I want to see what is the percentage of games that are rated and not rated

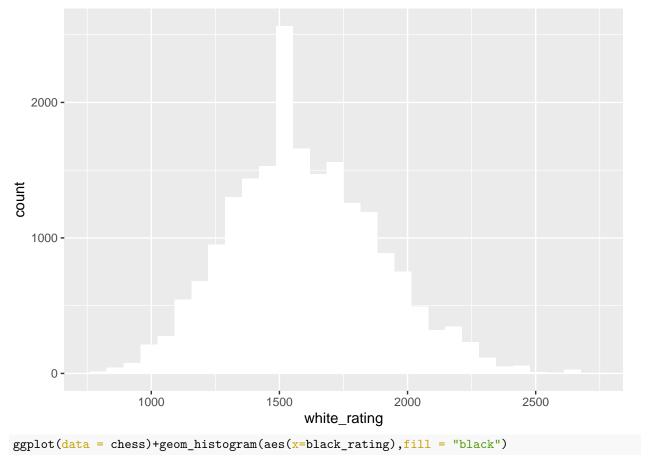
```
ggplot(chess,aes(x=toupper(rated)))+geom_bar()+xlab(label =
"Rated_Games")+ylab(label = "Frequency")+theme_classic()
```



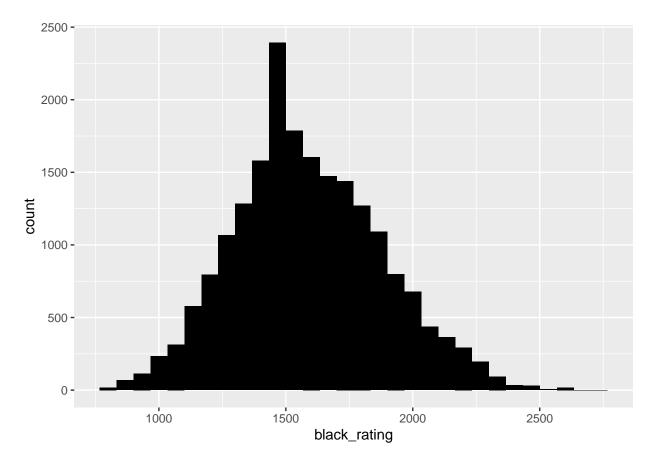
Step 2 I want to find out the average rating of both black and white. As you see the graph below, 1500 rating has the most people for both black and white. As the rating goes up or down, the amount of people drop significantly, which means that most people are around 1500 rating range.

```
ggplot(data = chess)+geom_histogram(aes(x=white_rating),fill = "white")
```

`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

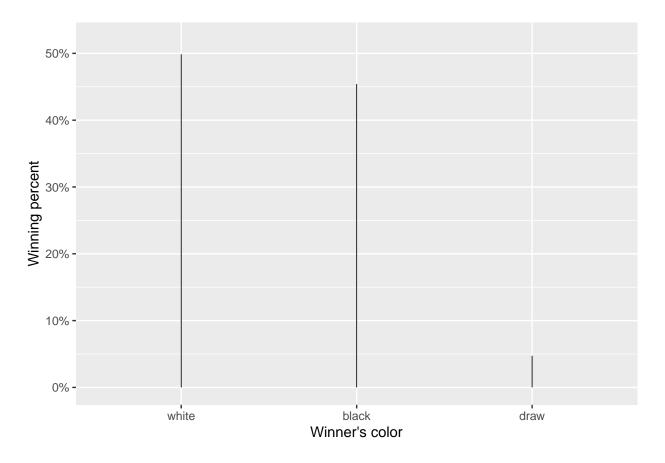


`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.



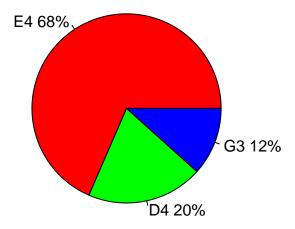
I want to check the winning percentage of white, black and draw. As you see the graph below, the winning percentage of white is 50% and for black is around 45% and there are 5% of draw. The reason why white has the highest winning percentage because white can move first and can choose it's own favorite opening. Therefore, it will has the highest winning percentage.

```
chess %>%
  group_by(winner) %>%
  summarise(count = n(), .groups = 'drop') %>%
  mutate(count = count/sum(count)) %>%
  ggplot(., aes(reorder(winner, -count), count))+
  geom_segment(aes(xend = winner, yend = 0), size = 0.3, colour = "black")+
  scale_y_continuous(labels = scales::percent_format(accuracy = 1), limits = c(0,0.52))+
  labs(x = "Winner's color", y = "Winning percent")
```



In this step, I want to check what is the top 10 opening moves. 7 of them the first move is E4, which is 68% of the top ten opening move. D4 comes in the second at 20%. And G3 is around 13%. As shown in the pie chart below.

Opening move



Step 5

I want to find out what is the top 10 opening being played on lichess through database.

opening<-filter(summarise(group_by(chess,opening_name), count=length(opening_name)),count>200)
opening

```
## # A tibble: 10 x 2
##
      opening name
                                                    count
##
      <chr>
                                                    <int>
##
   1 French Defense: Knight Variation
                                                      271
## 2 Horwitz Defense
                                                      209
  3 Queen's Pawn Game: Chigorin Variation
                                                      229
## 4 Queen's Pawn Game: Mason Attack
                                                      232
   5 Scandinavian Defense
                                                      223
  6 Scandinavian Defense: Mieses-Kotroc Variation
##
                                                      259
## 7 Scotch Game
                                                      271
## 8 Sicilian Defense
                                                      358
## 9 Sicilian Defense: Bowdler Attack
                                                      296
## 10 Van't Kruijs Opening
                                                      368
```

Step 6

I calculated how many games are win by each side so that later on I will be able to find the highest winning percentage for both colors.

```
chess%>%
group_by(winner)
```

```
## # A tibble: 20,058 x 16
## # Groups:
              winner [3]
##
      id
              rated
                        created_at last_move_at turns victory_status winner
##
      <chr>
              <chr>>
                             <dbl>
                                          <dbl> <int> <chr>
                                                                      <chr>
   1 TZJHL1jE FALSE 1504210000000 1504210000000
                                                 13 outoftime
                                                                     white
  2 11NXvwaE TRUE 1504130000000 1504130000000
##
                                                   16 resign
                                                                     black
  3 mIICvQHh TRUE 1504130000000 1504130000000
                                                   61 mate
                                                                     white
  4 kWKvrqYL TRUE 1504110000000 1504110000000
                                                   61 mate
                                                                     white
```

```
## 5 9tXo1AUZ TRUE 1504030000000 1504030000000
                                                    95 mate
                                                                       white
## 6 MsoDV9wj FALSE 150424000000 150424000000
                                                     5 draw
                                                                       draw
## 7 gwU9rasv TRUE 1504230000000 1504230000000
                                                    33 resign
                                                                       white
## 8 RVNON3VK FALSE 1503680000000 1503680000000
                                                     9 resign
                                                                       black
## 9 dwF3DJHO TRUE 1503510000000 1503510000000
                                                    66 resign
                                                                       black
## 10 afoMwnLg TRUE 1503440000000 1503440000000
                                                    119 mate
                                                                       white
## # ... with 20,048 more rows, and 9 more variables: increment code <chr>,
       white_id <chr>, white_rating <int>, black_id <chr>, black_rating <int>,
       moves <chr>, opening_eco <chr>, opening_name <chr>, opening_ply <int>
white_game<-0
black_game<-0
draw_game<-0
for(game in chess$winner){
  if(game=="white"){
    white_game<-white_game+1
  }else if(game=="black"){
   black_game<-black_game+1
  }else(draw_game<-draw_game+1)</pre>
paste("There were", white_game, "white wins and", draw_game, "draws and", black_game, "black wins")
```

[1] "There were 10001 white wins and 950 draws and 9107 black wins"

Step 7

I want to find out the top 10 highest opening winning percentage for white color. I divide it by 10001 because in step 6 I found out that there are 10001 games win by white.

```
white<-chess%>%
  filter(winner=='white')%>%
  group_by(opening_name)%>%
  count()%>%
  mutate(percent=n/10001)%>%
  arrange(desc(percent))
white
## # A tibble: 1,181 x 3
## # Groups:
              opening_name [1,181]
##
      opening_name
                                                       n percent
##
      <chr>
                                                    <int>
                                                            <dbl>
## 1 Scandinavian Defense: Mieses-Kotroc Variation
                                                     164 0.0164
## 2 Sicilian Defense
                                                     149 0.0149
## 3 Scotch Game
                                                     145 0.0145
## 4 French Defense: Knight Variation
                                                     135 0.0135
## 5 Philidor Defense #3
                                                     127 0.0127
## 6 Van't Kruijs Opening
                                                     126 0.0126
## 7 Sicilian Defense: Bowdler Attack
                                                     119 0.0119
## 8 Queen's Pawn Game: Mason Attack
                                                     116 0.0116
## 9 Queen's Pawn Game: Chigorin Variation
                                                     112 0.0112
## 10 Horwitz Defense
                                                     110 0.0110
## # ... with 1,171 more rows
```

I want to find out the top 10 highest opening winning percentage for black color. I divide it by 9107 because in step 6 I found out that there are 9107 games win by black.

```
black<-chess%>%
 filter(winner=='black')%>%
 group_by(opening_name)%>%
 count()%>%
 mutate(percent=n/9107)%>%
 arrange(desc(percent))
black
## # A tibble: 1,145 x 3
              opening_name [1,145]
## # Groups:
##
     opening_name
                                               n percent
##
      <chr>
                                           <int>
                                                   <dbl>
##
  1 Van't Kruijs Opening
                                             226 0.0248
## 2 Sicilian Defense
                                             194 0.0213
## 3 Sicilian Defense: Bowdler Attack
                                             164 0.0180
## 4 Scandinavian Defense
                                             123 0.0135
## 5 French Defense: Knight Variation
                                             121 0.0133
## 6 Scotch Game
                                             115 0.0126
## 7 Queen's Pawn Game: Chigorin Variation
                                             109 0.0120
## 8 Queen's Pawn Game: Mason Attack
                                             103 0.0113
## 9 Indian Game
                                             100 0.0110
## 10 Philidor Defense #2
                                              96 0.0105
## # ... with 1,135 more rows
```

Step 9

I want to find out the top 10 highest opening drawing percentage. I divide it by 950 because in step 6 I found out that there are 950 draw games.

```
draw<-chess%>%
  filter(winner=='draw')%>%
  group_by(opening_name)%>%
  count()%>%
  mutate(percent=n/950)%>%
  arrange(desc(percent))
draw
## # A tibble: 413 x 3
## # Groups:
              opening_name [413]
##
      opening_name
                                                n percent
##
      <chr>
                                             <int>
                                                    <dbl>
  1 Van't Kruijs Opening
                                               16 0.0168
## 2 French Defense: Knight Variation
                                                15 0.0158
## 3 Sicilian Defense
                                               15 0.0158
## 4 Queen's Pawn Game: Mason Attack
                                               13 0.0137
## 5 Sicilian Defense: Bowdler Attack
                                               13 0.0137
## 6 Indian Game
                                                12 0.0126
## 7 Italian Game
                                               12 0.0126
## 8 Scotch Game
                                                11 0.0116
## 9 Italian Game: Anti-Fried Liver Defense
                                                10 0.0105
## 10 Scandinavian Defense
                                                10 0.0105
```

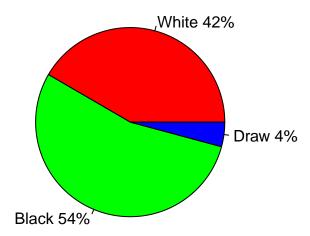
```
## # ... with 403 more rows
```

I compare the winning percentage for white, black, and draw. I found out that Scotch game and Sicillian game are both in the top 10 openings. The data are all in step 7 through 9.

Step 11

I take out the games that are played by sicillian defense and make this pie chart. As shown in this pie chart, when you play with black while using sicillian defense you have a 54% of winning the game, which is more then half of the chance.

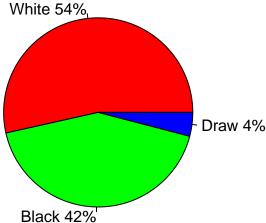
Sicillian Defense



Step 12

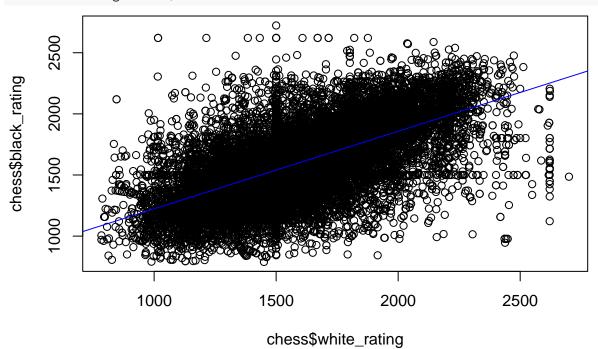
I take out the games that are played by scotch game and make this pie chart. As shown in this pie chart, when you play with white while using scotch game you have a 54% of winning the game, which is more then half of the chance.

Scotch Game



Linear Regression Comparing white rating to black rating.

```
plot(chess$white_rating,chess$black_rating)
chess.regression <-lm(white_rating~black_rating,data = chess)
abline(chess.regression, col ="blue")</pre>
```



Challenges The main challenges that I faced are that the data I tried to analyze are all mainly words, so I need to keep on using filter in order to compare the data. It is hard to made the linear regression out of the data that I have chose. But I managed to make it at last. Because I couldn't make linear regression in the beginning, I decided to make pie and bar chart.

Why I didn't choose Van't kruijs Opening

The reason why I didn't choose Van't Kruijs Opening because this opening is start from E3, which is not even in the top opening first moves despite being one of the top opening. The reason why it is one of the top opening is because there are not that many opening that start with E3 move. So if e3 is played, there is a

very high chance that it will be Van't Krujs Opening.

Conclusion

Base on this dataset and what GM Hikaru has said. I will play white using scotch game and black using sicillian defense. Even though I never played these two openings before, I am going to start learning these openings. If I has taken this class earler, I might have a higher rating if I know that these two are the top openings for white and black. From now on when I play chess, I will focus on scotch game and sicillian defense.