

VISUALIZATION PROJECT UNIT 1

SHREYAN CHAKRABORTY

2022-10-29

```
library(tidyverse)

## -- Attaching packages ----- tidyverse 1.3.2 --
## v ggplot2 3.3.6     v purrr   0.3.4
## v tibble  3.1.8     v dplyr    1.0.9
## v tidyrr  1.2.0     v stringr  1.4.0
## v readr   2.1.2     v forcats 0.5.1
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter()  masks stats::filter()
## x dplyr::lag()     masks stats::lag()

chess_dataset<-read.csv('C:/Users/91974/Desktop/cmi study/Chess games stats.csv')
head(chess_dataset)

##   X Game.ID White.Rating Black.Rating Opening.ECO Opening.Ply
## 1 0 J7Xvjkte      1441      1559      C20       4
## 2 1 SSzpi7W1       1258      1567      C46       6
## 3 2 NHpcYm3r       1697      1712      C68       7
## 4 3 Nrzmngzmn     1978      1868      D31       5
## 5 4 xMuFsnC6       2073      1816      A01       2
## 6 5 gcdFqoqK       1944      2052      C44       9
##   White.Centi.pawn.Loss White.s.Number.of.Inaccuracies
## 1                      32                           2
## 2                      43                           0
## 3                      11                           1
## 4                      21                           3
## 5                      35                           3
## 6                      79                           3
##   White.s.Number.of.Mistakes White.s.Number.of.Blunders Black.Centi.pawn.Loss
## 1                         2                           0                     87
## 2                         0                           1                     6
## 3                         0                           0                     42
## 4                         0                           0                     53
## 5                         2                           0                     50
## 6                         0                           2                     62
##   Black.s.Number.of.Inaccuracies Black.s.Number.of.Mistakes
## 1                         2                           4
## 2                         0                           0
## 3                         1                           0
## 4                         6                           0
## 5                         6                           3
## 6                         3                           1
##   Black.s.Number.of.Blunders
```

```

## 1          1
## 2          0
## 3          2
## 4          1
## 5          0
## 6          1

summary(chess_dataset)

##           X      Game.ID     White.Rating  Black.Rating
## Min. : 0 Length:18637    Min. : 784    Min. : 780
## 1st Qu.: 4659 Class :character 1st Qu.:1551   1st Qu.:1552
## Median : 9318 Mode  :character Median :1782    Median :1781
## Mean   : 9318                   Mean  :1775    Mean  :1777
## 3rd Qu.:13977                  3rd Qu.:1991   3rd Qu.:1996
## Max.  :18636                  Max. :2997    Max. :2995
## Opening.ECO       Opening.Ply White.Centi.pawn.Loss
## Length:18637      Min.   : 1.000 Min.   : 0.00
## Class :character  1st Qu.: 3.000 1st Qu.: 33.00
## Mode  :character  Median : 5.000 Median : 53.00
##                   Mean   : 5.319 Mean   : 58.81
##                   3rd Qu.: 7.000 3rd Qu.: 77.00
##                   Max.   :28.000 Max.   :517.00
## White.s.Number.of.Inaccuracies White.s.Number.of.Mistakes
## Min.   : 0.000      Min.   : 0.000
## 1st Qu.: 1.000      1st Qu.: 0.000
## Median : 3.000      Median : 1.000
## Mean   : 3.259      Mean   : 1.326
## 3rd Qu.: 5.000      3rd Qu.: 2.000
## Max.   :19.000      Max.   :12.000
## White.s.Number.of.Blunders Black.Centi.pawn.Loss
## Min.   : 0.000      Min.   : 0.00
## 1st Qu.: 1.000      1st Qu.: 33.00
## Median : 2.000      Median : 55.00
## Mean   : 2.116      Mean   : 60.78
## 3rd Qu.: 3.000      3rd Qu.: 80.00
## Max.   :18.000      Max.   :550.00
## Black.s.Number.of.Inaccuracies Black.s.Number.of.Mistakes
## Min.   : 0.000      Min.   : 0.000
## 1st Qu.: 1.000      1st Qu.: 0.000
## Median : 3.000      Median : 1.000
## Mean   : 3.283      Mean   : 1.332
## 3rd Qu.: 5.000      3rd Qu.: 2.000
## Max.   :22.000      Max.   :12.000
## Black.s.Number.of.Blunders
## Min.   : 0.000
## 1st Qu.: 1.000
## Median : 2.000
## Mean   : 2.118
## 3rd Qu.: 3.000
## Max.   :22.000

attach(chess_dataset)
Op=array(chess_dataset["Opening.Ply"])
counter<-c(rep(0,28))

```

```

for(i in 1:18637){for(j in 1:28){
  if(Opening.Ply[i]==j){counter[j]<-counter[j]+1}
}}
Mop<-max(Opening.Ply)
CO<-as.data.frame(counter)
N_PLY<-c(seq(1,28,1))
CO["OPENING_PLY"]<-N_PLY

```

Plots

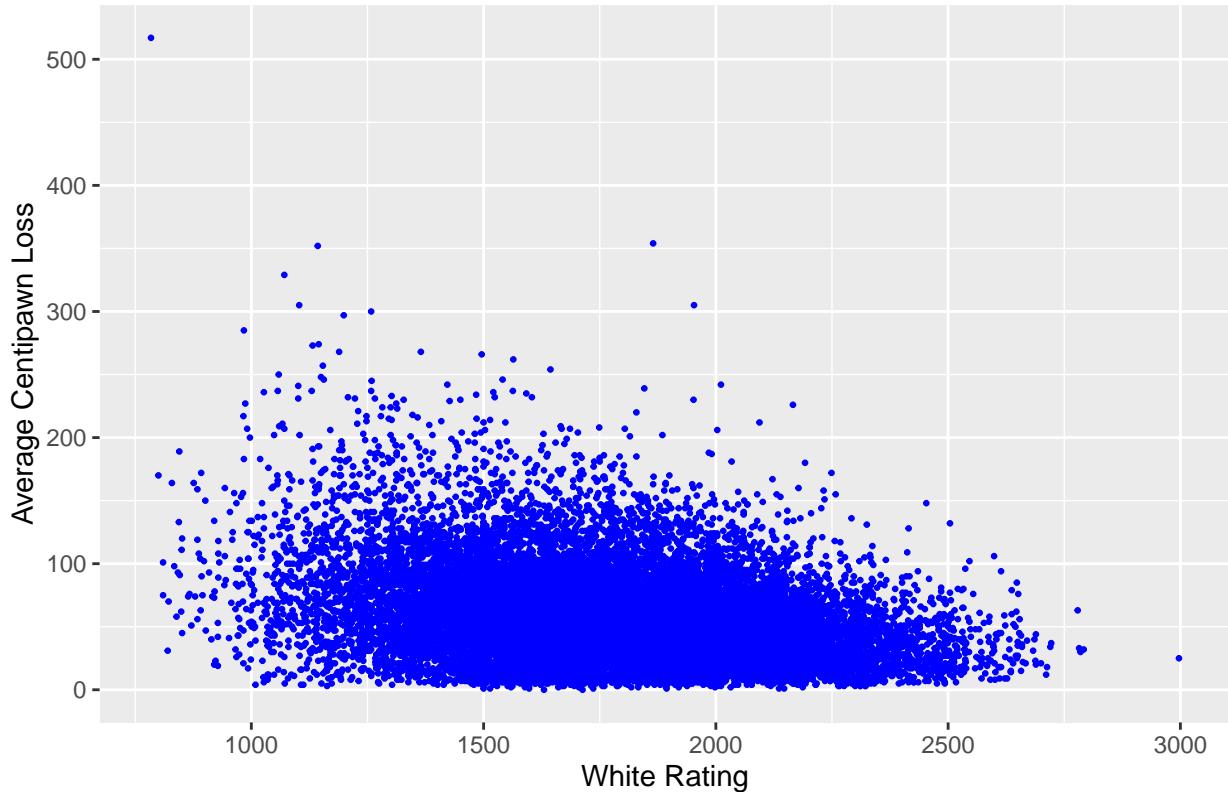
Some of the useful plots are as follows:

```

ggplot(chess_dataset, aes(x=(White.Rating), y=(White.Centi.pawn.Loss))) +
  geom_point(col="blue",size=0.5) +
  labs(title="ACCURACY OF GAMES")+
  xlab("White Rating")+
  ylab("Average Centipawn Loss")

```

ACCURACY OF GAMES

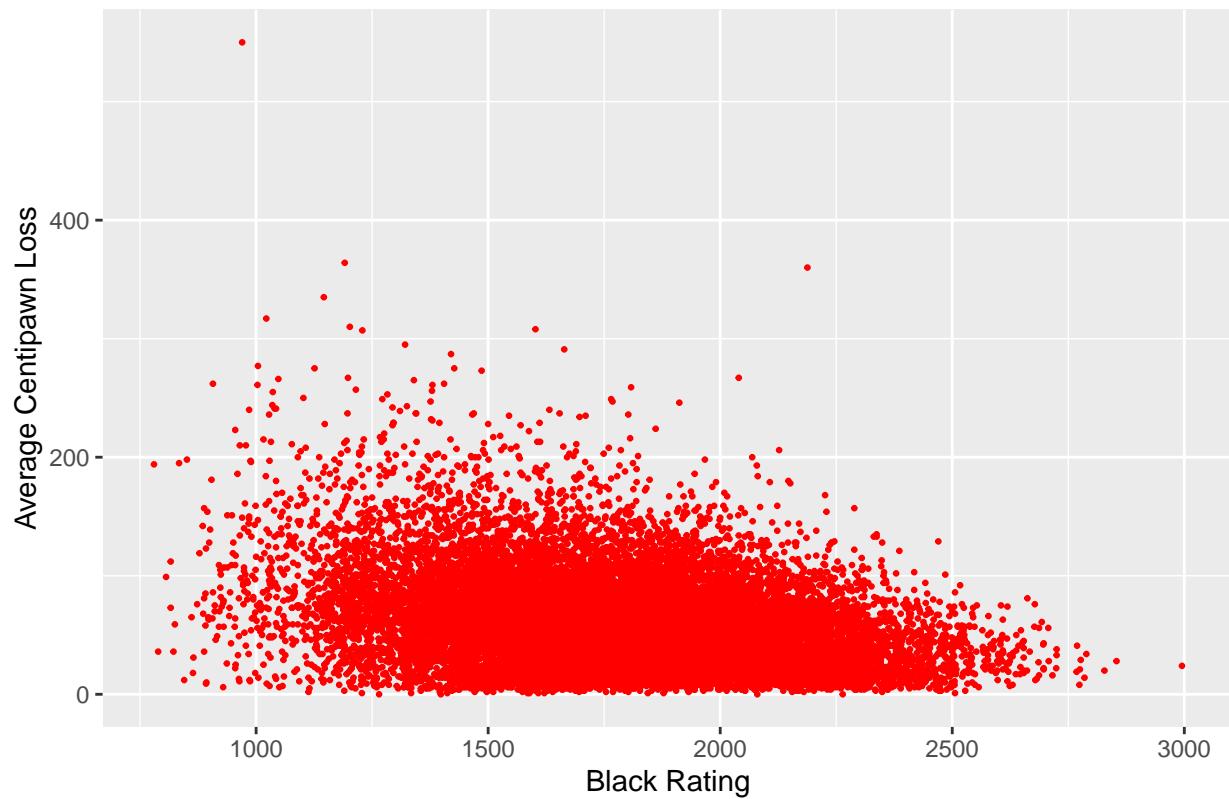


```

ggplot(chess_dataset, aes(x=(Black.Rating), y=(Black.Centi.pawn.Loss))) +
  geom_point(col="red",size=0.5) +
  labs(title="ACCURACY OF GAMES")+
  xlab("Black Rating")+
  ylab("Average Centipawn Loss")

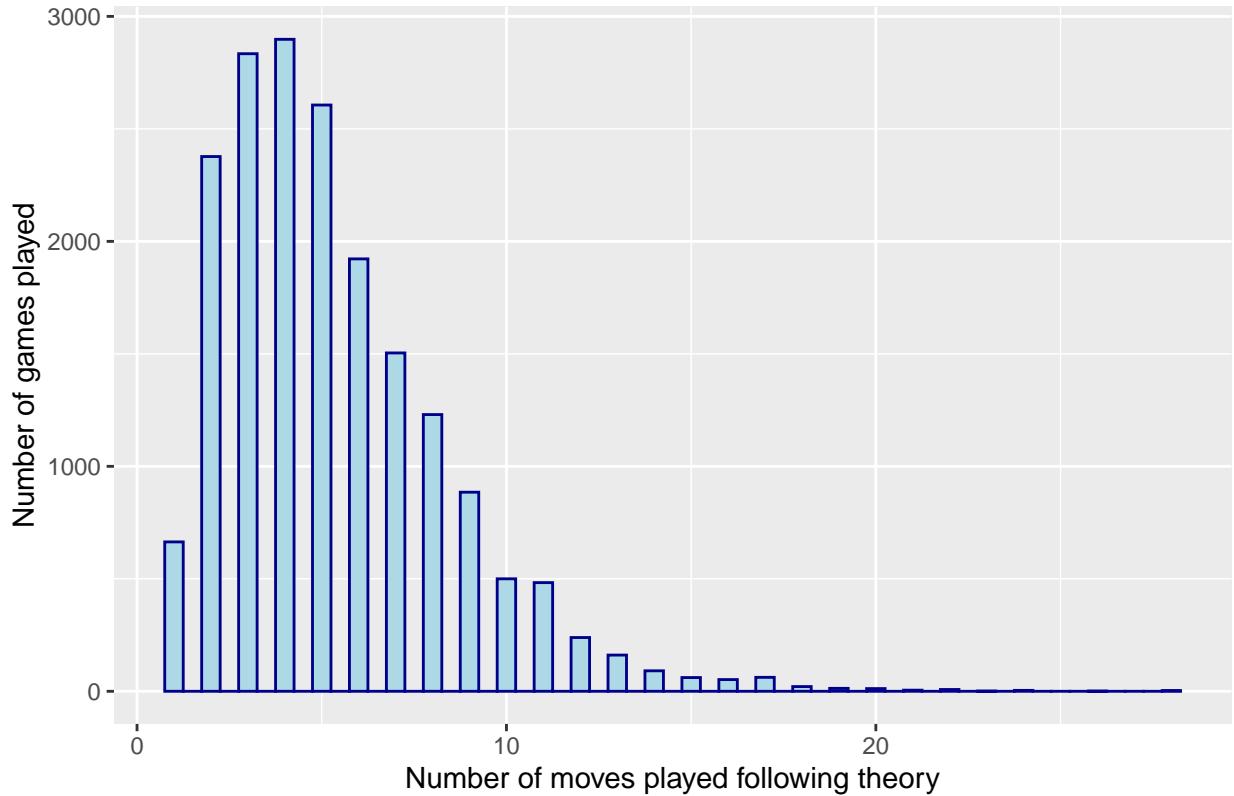
```

ACCURACY OF GAMES



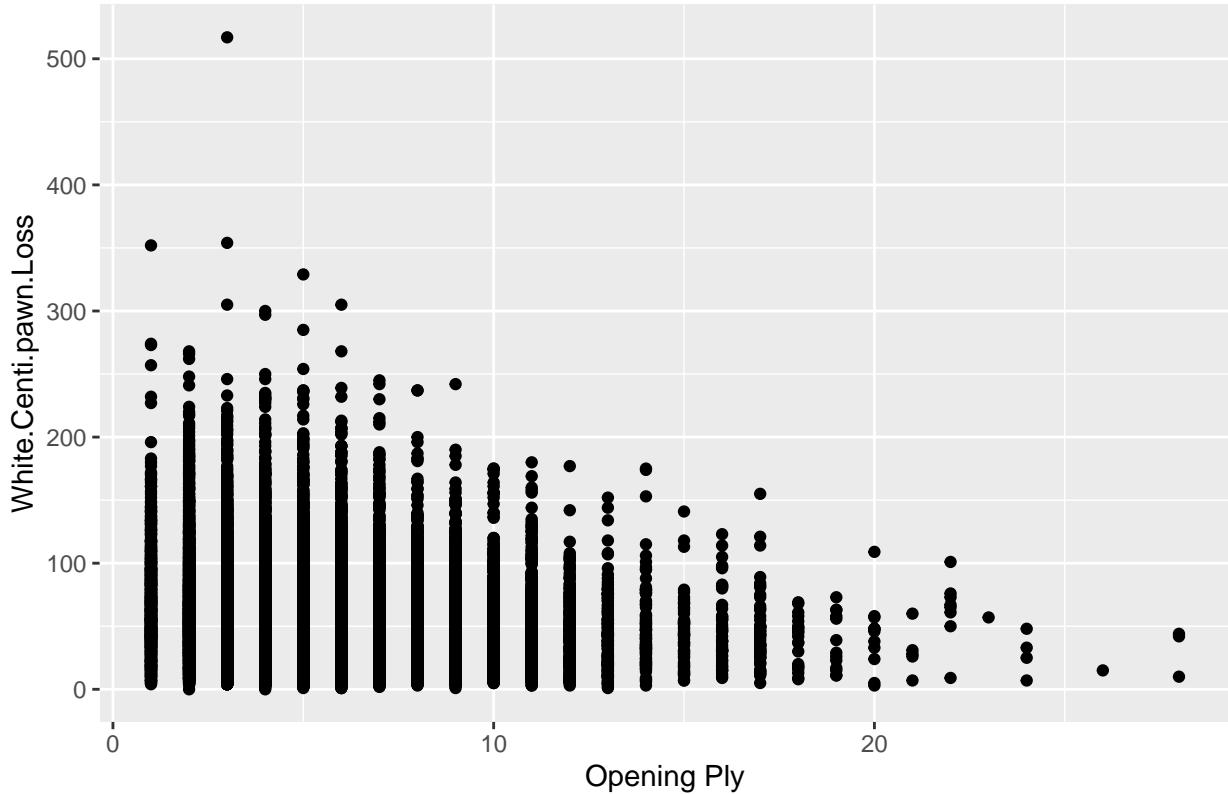
```
ggplot(chess_dataset,aes(x=Opening.Ply)) +  
  geom_histogram(bins=28,binwidth=0.5,color="darkblue",fill="lightblue") +  
  labs(title="MAIN LINE THEORY") +  
  xlab("Number of moves played following theory") +  
  ylab("Number of games played")
```

MAIN LINE THEORY



```
ggplot(chess_dataset, aes(x=Opening.Ply, y=White.Centi.pawn.Loss))+  
  geom_point() +  
  labs(title="ACCURACY OF GAMES", x="Opening Ply") +  
  theme(plot.title = element_text(hjust = 0.5))
```

ACCURACY OF GAMES

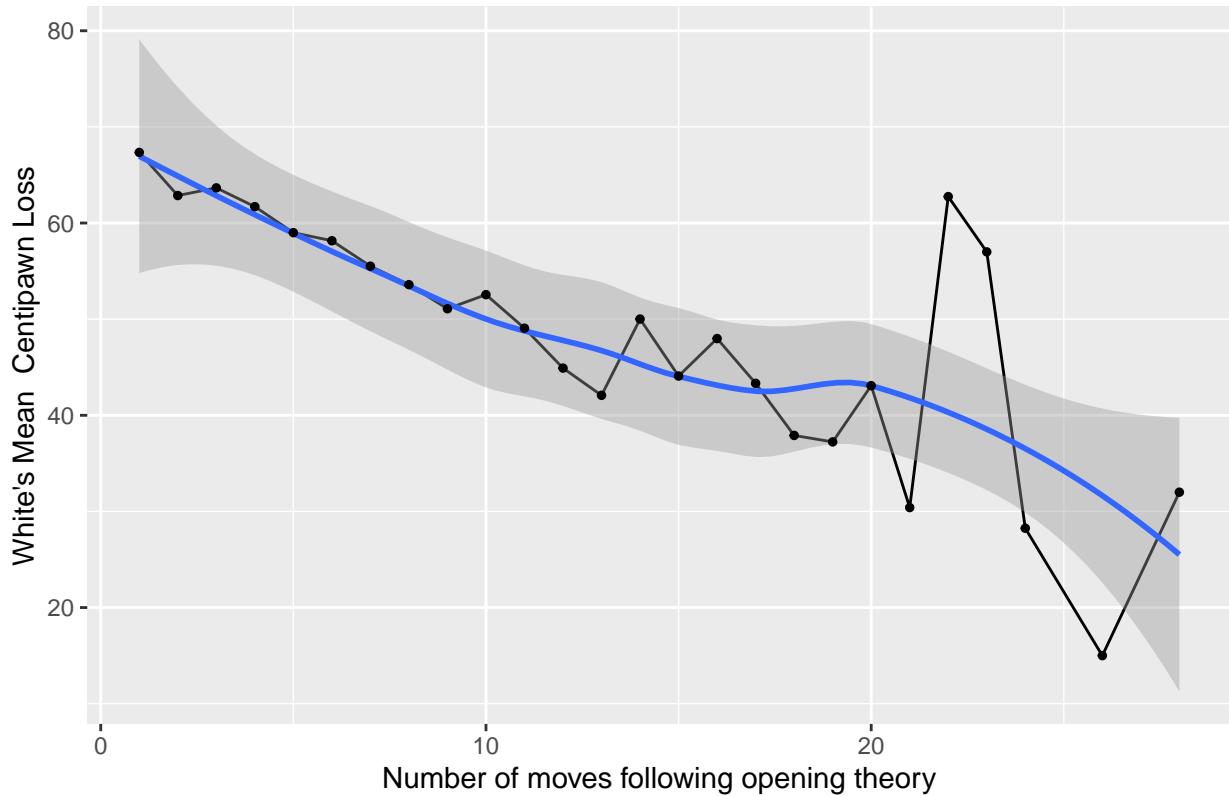


Note that the `echo = FALSE` parameter was added to the code chunk to prevent printing of the R code that generated the plot.

```
chess_dataset %>%
  select(Opening.Ply, White.Centi.pawn.Loss) %>%
  group_by(Opening.Ply) %>%
  summarise(mean_wcp1 = mean(White.Centi.pawn.Loss)) %>%
  ggplot(aes(Opening.Ply, mean_wcp1)) +
  geom_line() +
  geom_smooth() +
  geom_point(size = 1) +
  labs(title = "White's average centipawn loss when following theory",
       x = "Number of moves following opening theory",
       y = "White's Mean Centipawn Loss")

## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
```

White's average centipawn loss when following theory



```
chess_dataset %>%
  select(Opening.Ply, White.Centi.pawn.Loss) %>%
  group_by(Opening.Ply) %>%
  summarise(mean_wcp1 = mean(White.Centi.pawn.Loss),
            sd_wcp1 = sd(White.Centi.pawn.Loss)) %>%
  filter(!is.na(sd_wcp1))

## # A tibble: 24 x 3
##   Opening.Ply mean_wcp1 sd_wcp1
##       <int>     <dbl>    <dbl>
## 1 1             67.3     41.6
## 2 2             62.9     37.0
## 3 3             63.7     38.0
## 4 4             61.7     37.9
## 5 5             59.0     37.6
## 6 6             58.2     36.7
## 7 7             55.5     34.5
## 8 8             53.6     32.4
## 9 9             51.1     32.2
## 10 10            52.5     32.5
## # ... with 14 more rows
## # i Use `print(n = ...)` to see more rows

df1 <- chess_dataset %>%
  select(White.s.Number.of.Inaccuracies, White.Centi.pawn.Loss) %>%
  group_by(White.s.Number.of.Inaccuracies) %>%
  summarise(mean_wcp1 = mean(White.Centi.pawn.Loss))
```

```

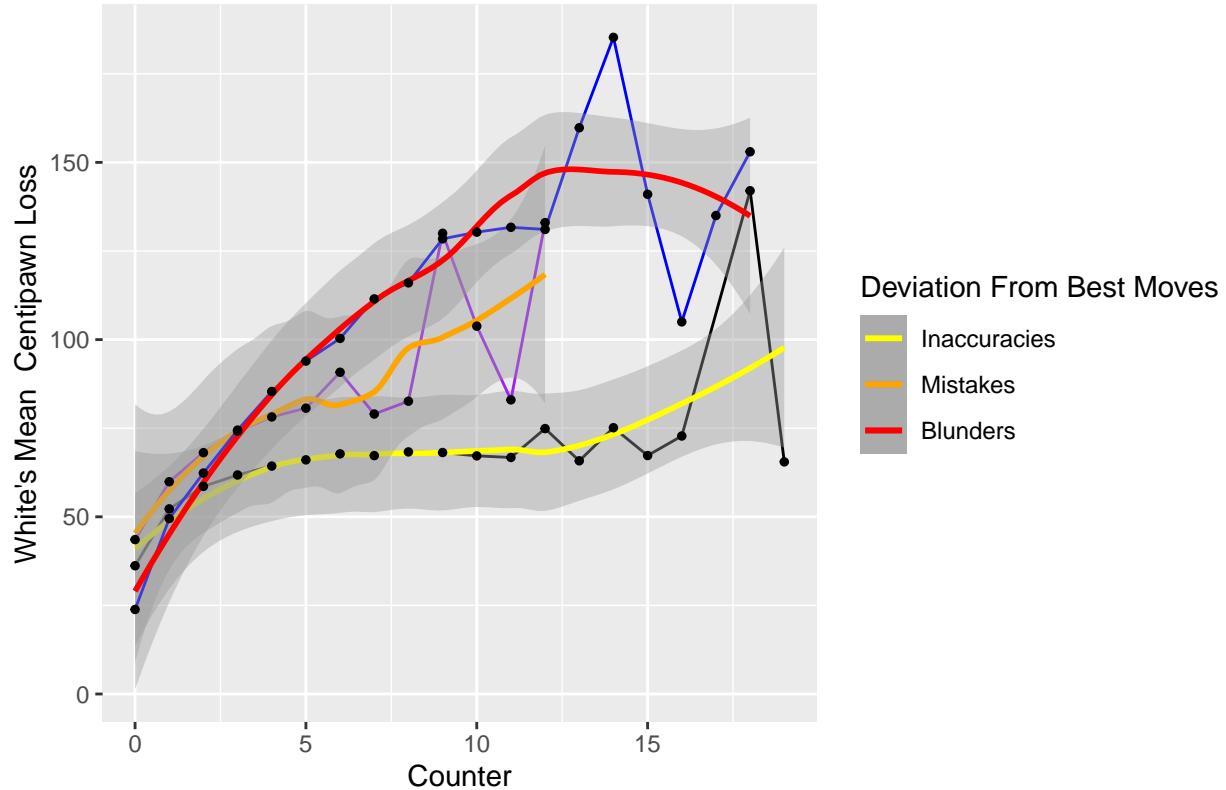
df2 <- chess_dataset %>%
  select(White.s.Number.of.Mistakes, White.Centi.pawn.Loss) %>%
  group_by(White.s.Number.of.Mistakes) %>%
  summarise(mean_wcp12 = mean(White.Centi.pawn.Loss))
df3 <- chess_dataset %>%
  select(White.s.Number.of.Blunders, White.Centi.pawn.Loss) %>%
  group_by(White.s.Number.of.Blunders) %>%
  summarise(mean_wcp13 = mean(White.Centi.pawn.Loss))
ggplot(data=df1,aes(White.s.Number.of.Inaccuracies,mean_wcp1)) +
  geom_line()+
  geom_smooth(aes(color="Yellow")) +
  scale_color_identity(guide = "legend")+
  geom_line(data=df2,aes(White.s.Number.of.Mistakes,mean_wcp12),col="purple")+
  geom_smooth(data=df2,aes(White.s.Number.of.Mistakes,mean_wcp12,color="Orange"))+
  scale_color_identity(guide = "legend")+
  geom_line(data=df3,aes(White.s.Number.of.Blunders,mean_wcp13),col="blue")+
  geom_smooth(data=df3,aes(White.s.Number.of.Blunders,mean_wcp13,color="Red"))+
  scale_color_identity(breaks = c("Yellow", "Orange", "Red"),
                       labels = c("Inaccuracies", "Mistakes", "Blunders"),guide = "legend")+
  geom_point(size = 1) +
  geom_point(data=df2,aes(White.s.Number.of.Mistakes,mean_wcp12),size=1)+ 
  geom_point(data=df3,aes(White.s.Number.of.Blunders,mean_wcp13),size=1) +
  labs(title = "Centipawn loss for Inaccuracies,Mistakes and Blunders",
       x = "Counter",
       y = "White's Mean Centipawn Loss",
       color="Deviation From Best Moves")

## Scale for 'colour' is already present. Adding another scale for 'colour',
## which will replace the existing scale.
## Scale for 'colour' is already present. Adding another scale for 'colour',
## which will replace the existing scale.

## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'

```

Centipawn loss for Inaccuracies, Mistakes and Blunders



```

ggsave(filename = "graph1.png",
       path = "C:/Users/91974/Desktop/cmi study/Graphs/",
       dpi = 300,
       device = "png")

## Saving 6.5 x 4.5 in image
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
dF1 <- chess_dataset %>%
  select(Black.s.Number.of.Inaccuracies, White.Centi.pawn.Loss)    %>%
  group_by(Black.s.Number.of.Inaccuracies) %>%
  summarise(mean_wBcp11 = mean(White.Centi.pawn.Loss))
dF2 <- chess_dataset %>%
  select(Black.s.Number.of.Mistakes, White.Centi.pawn.Loss)    %>%
  group_by(Black.s.Number.of.Mistakes) %>%
  summarise(mean_wBcp12 = mean(White.Centi.pawn.Loss))
dF3 <- chess_dataset %>%
  select(Black.s.Number.of.Blunders, White.Centi.pawn.Loss)    %>%
  group_by(Black.s.Number.of.Blunders) %>%
  summarise(mean_wBcp13 = mean(White.Centi.pawn.Loss))
ggplot(data=dF1,aes(Black.s.Number.of.Inaccuracies,mean_wBcp11)) +
  geom_line()+
  geom_smooth(aes(color="Yellow")) +
  scale_color_identity(guide = "legend")+
  geom_line(data=dF2,aes(Black.s.Number.of.Mistakes,mean_wBcp12),col="purple")+

```

```

geom_smooth(data=df2,aes(Black.s.Number.of.Mistakes,mean_wBcp12,color="Orange"))+
scale_color_identity(guide = "legend")+
geom_line(data=df3,aes(Black.s.Number.of.Blunders,mean_wBcp13),col="blue")+
geom_smooth(data=df3,aes(Black.s.Number.of.Blunders,mean_wBcp13,color="Red"))+
scale_color_identity(breaks = c("Yellow", "Orange", "Red"),
labels = c("Inaccuracies", "Mistakes", "Blunders"),guide = "legend")+
geom_point(size = 1) +
geom_point(data=df2,aes(Black.s.Number.of.Mistakes,mean_wBcp12),size=1)+  

  geom_point(data=df3,aes(Black.s.Number.of.Blunders,mean_wBcp13),size=1)+  

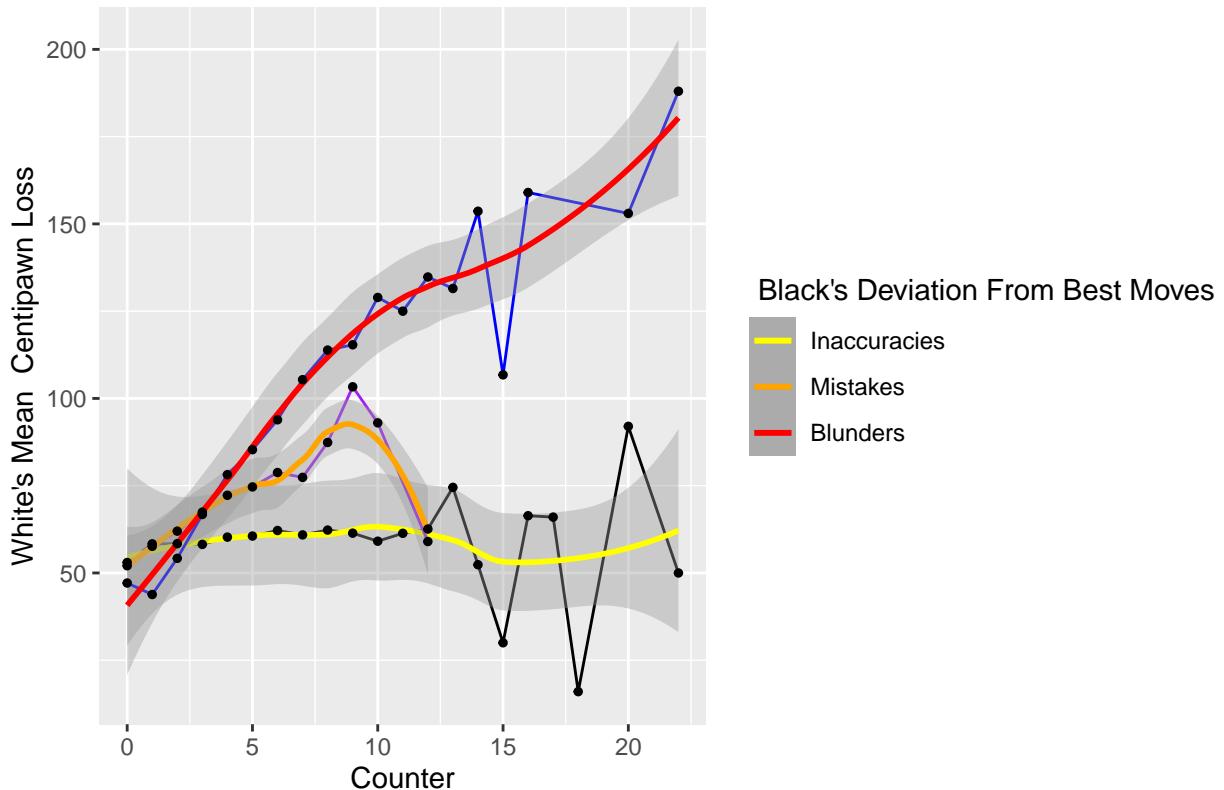
  labs(title = "Centipawn loss for Inaccuracies,Mistakes and Blunders",
  x = "Counter",
  y = "White's Mean Centipawn Loss",
  color=" Black's Deviation From Best Moves")

## Scale for 'colour' is already present. Adding another scale for 'colour',
## which will replace the existing scale.
## Scale for 'colour' is already present. Adding another scale for 'colour',
## which will replace the existing scale.

## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'
## `geom_smooth()` using method = 'loess' and formula 'y ~ x'

```

Centipawn loss for Inaccuracies,Mistakes and Blunders



```

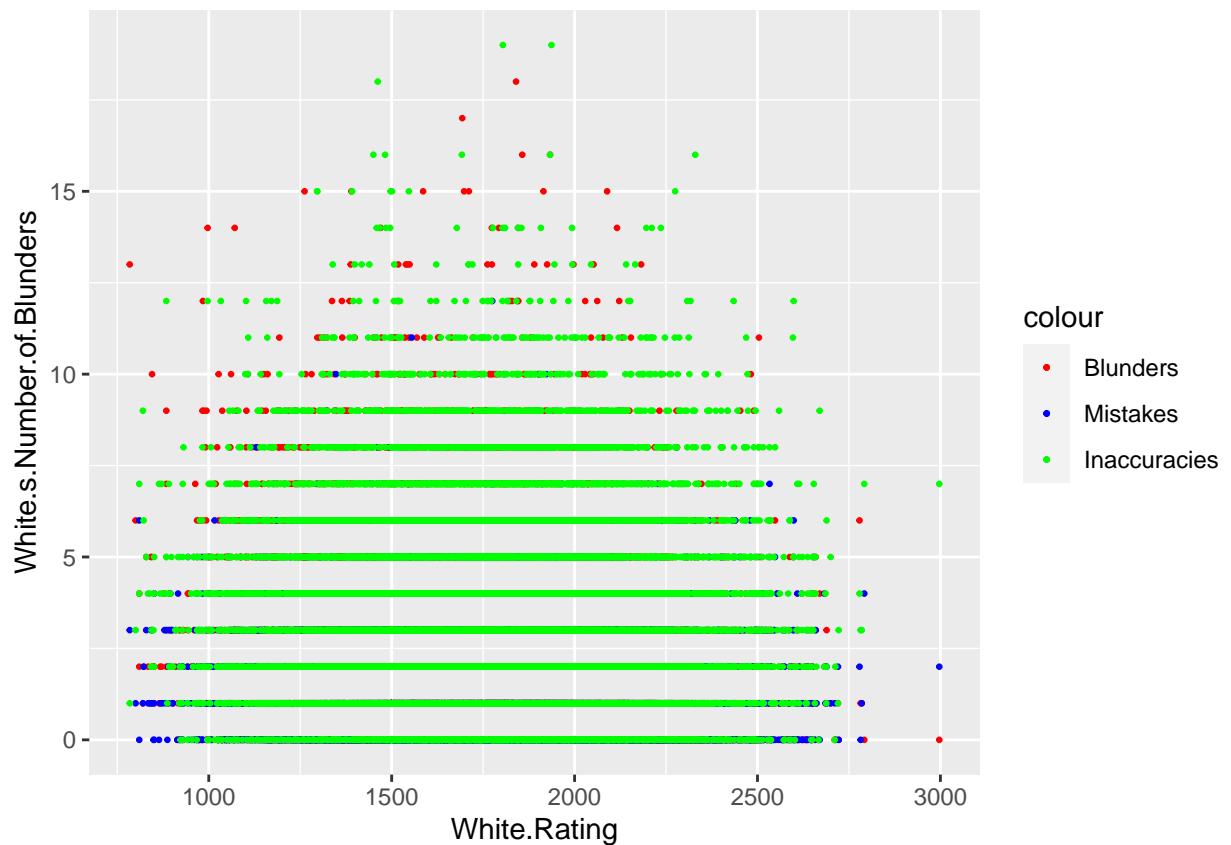
dt1<-chess_dataset %>%
  select(White.Rating,White.s.Number.of.Blunders)
dt2<-chess_dataset %>%
  select(White.Rating,White.s.Number.of.Mistakes)

```

```

dt3<-chess_dataset %>%
  select(White.Rating,White.s.Number.of.Inaccuracies)
ggplot(data=dt1,aes(White.Rating,White.s.Number.of.Blunders))+ 
  geom_point(aes(color="Red"),size=0.5)+ 
  geom_point(data=dt2,aes(White.Rating,White.s.Number.of.Mistakes,color="Blue"),size=0.5)+ 
  geom_point(data=dt3,aes(White.Rating,White.s.Number.of.Inaccuracies,color="Green"),size=0.5)+ 
  scale_color_identity(breaks = c("Red", "Blue", "Green"),
                        labels = c("Blunders", "Mistakes", "Inaccuracies"),guide = "legend")

```



```

x1<-chess_dataset %>%
  select(White.s.Number.of.Blunders)
x1["Counter"]<-(c(rep(1,18637)))
x3<-chess_dataset %>%
  select(White.s.Number.of.Mistakes)
x3["Counter"]<-(c(rep(2,18637)))
x5<-chess_dataset %>%
  select(White.s.Number.of.Inaccuracies)
x5["Counter"]<-(c(rep(3,18637)))
colnames(x1)<-c("Value","Counter")
colnames(x3)<-c("Value","Counter")
colnames(x5)<-c("Value","Counter")
x2<-rbind(x1,x3)
x4<-rbind(x2,x5)

x4 %>%
  ggplot(aes(Value,group=Counter,fill=as.factor(Counter)))+

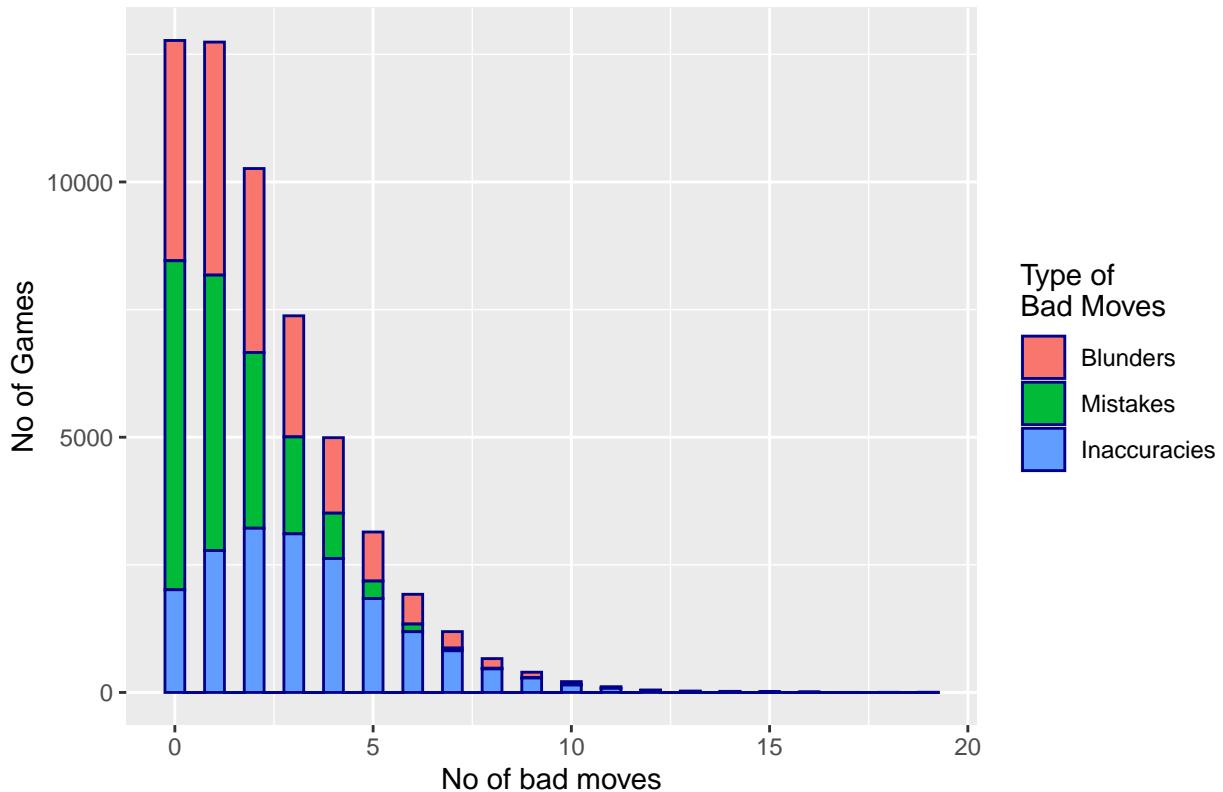
```

```

geom_histogram(bins=28, binwidth=0.5, color="darkblue")+
guides(color = guide_legend(title = "Deviations from Best Move"))+
scale_fill_discrete(labels=c("Blunders", "Mistakes", "Inaccuracies")) +
labs(y="No of Games", x="No of bad moves", fill="Type of\nBad Moves", title="Proportion of Games by no

```

Proportion of Games by no of Bad Moves



```

## scale_x_discrete(limits=c("Blunders", "Mistakes", "Inaccuracies"))
##x4 %>%
##  ggplot(aes(x="",y=Value,fill=as.factor(Counter)))
##  geom_bar(stat="identity", width=1) +
#coord_polar("y", start=0)

```

```

y1<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "C0")) | str_detect(Opening.ECO, "C1")) %>%
  group_by(Opening.ECO) %>%
  summarise(avg_wcp1 = mean(White.Centi.pawn.Loss))
ctm<-array(0,6)
ctm[1]<-mean(y1$avg_wcp1)
y2<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "C3")) %>%
  group_by(Opening.ECO) %>%
  summarise(avg_wcp11 = mean(White.Centi.pawn.Loss))
ctm[2]<-mean(y2$avg_wcp11)

y3<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "C5")) %>%
  group_by(Opening.ECO) %>%

```

```

    summarise(avg_wcp12 = mean(White.Centi.pawn.Loss))
ctm[3] <-mean(y3$avg_wcp12)

y4<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "C6")) %>%
  group_by(Opening.ECO) %>%
  summarise(avg_wcp13 = mean(White.Centi.pawn.Loss))
ctm[4] <-mean(y4$avg_wcp13)

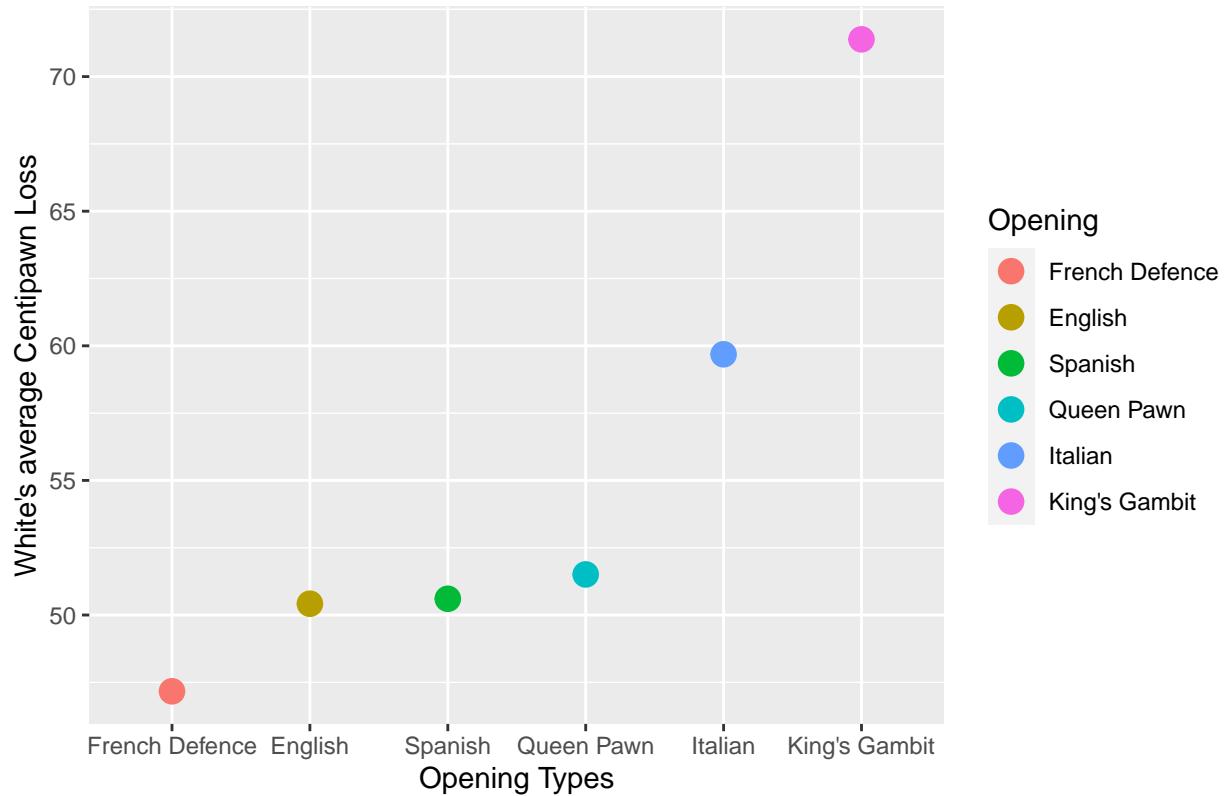
y5<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "A1") | str_detect(Opening.ECO, "A2")|str_detect(Opening.ECO, "A3"))
  group_by(Opening.ECO) %>%
  summarise(avg_wcp14 = mean(White.Centi.pawn.Loss))
ctm[5] <-mean(y5$avg_wcp14)

y6<-chess_dataset %>%
  filter(str_detect(Opening.ECO, "A4") | str_detect(Opening.ECO, "A5")|str_detect(Opening.ECO, "A6"))
  group_by(Opening.ECO) %>%
  summarise(avg_wcp15 = mean(White.Centi.pawn.Loss))
ctm[6] <-mean(y6$avg_wcp15)
BOX<-data.frame(ctm)
BOX[["Opening"]]<-c("French Defence","King's Gambit","Italian","Spanish","English","Queen Pawn")
colnames(BOX)<-c("White's average Centipawn Loss","Opening")

BOX %>%
  arrange(`White's average Centipawn Loss`) %>%
  mutate(Opening = fct_reorder(Opening, `White's average Centipawn Loss`)) %>%
  ggplot(aes(Opening,`White's average Centipawn Loss`,color=Opening))+
  geom_point(size=4)+
  labs(x = "Opening Types",title="Comparison of White's Openings")

```

Comparison of White's Openings



```
x = c("C123", "D234")
str_detect(x, "French Defence")

## [1] FALSE FALSE
```