Praca Domowa 1

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Zadanie zaczynam od wczytania wszelkich potrzebnych pakietów oraz ustawienia działania R.

```
options(stringsAsFactors=FALSE)
Tags <- read.csv("Tags.csv")
Users <- read.csv("Users.csv")
Votes <- read.csv("Votes.csv")
Posts <- read.csv("Posts.csv")
PostLinks <- read.csv("PostLinks.csv")
Comments <- read.csv("Comments.csv")
Badges <- read.csv("Badges.csv")
library(knitr)
library(dplyr)
library(data.table)
library(sqldf)
library(microbenchmark)</pre>
```

1 Zadanie 1

1.1 SQL

Celem jest znalezienie użytkowników, którzy uzyskali najwięcej Likes, wyswietlamy ich dane wraz z najwyżej ocenionym pytaniem.

```
df_sql_1 <- function(x,y){
sqldf("SELECT
    Users.DisplayName,
    Users.Age,
    Users.Location,
    SUM(Posts.FavoriteCount) AS FavoriteTotal,
    Posts.Title AS MostFavoriteQuestion,
    MAX(Posts.FavoriteCount) AS MostFavoriteQuestionLikes
FROM Posts

JOIN Users ON Users.Id=Posts.OwnerUserId
WHERE Posts.PostTypeId=1
GROUP BY OwnerUserId
ORDER BY FavoriteTotal DESC
LIMIT 10")
}</pre>
```

1.2 Base

Polecenie w base wyrzuca pewne warningi, lecz nie maja one znaczenia dla końcowego outputu.

```
df base 1 <- function(x,y){
  pos <- Posts[Posts$PostTypeId==1,]</pre>
  data <- merge(pos,Users,by.x="OwnerUserId",by.y="Id")</pre>
  maxi <- aggregate(data$FavoriteCount,by=data["OwnerUserId"],FUN=max,na.rm=TRUE) #bierzemy maksa
  sumi <- aggregate(data$FavoriteCount,by=data["OwnerUserId"],FUN=sum,na.rm=TRUE) #bierzemy sume</pre>
  pom <- merge(data,maxi,by.x=c("OwnerUserId","FavoriteCount"),by.y=c("OwnerUserId","x"))</pre>
  pom <- merge(pom,sumi,by="OwnerUserId")</pre>
  pom <- pom[,c("DisplayName", "Age", "Location", "x", "Title", "FavoriteCount")] #wybieramy co trzeba
  pom <- pom[order(pom$x,decreasing = TRUE),]</pre>
  pom <- pom[1:10,]
  colnames(pom) <- c("DisplayName", "Age", "Location", "FavoriteTotal",</pre>
                       "MostFavoriteQuestion", "MostFavoriteQuestionLikes") #zgodnosc nazw
  pom$MostFavoriteQuestion <- as.character(pom$MostFavoriteQuestion)</pre>
  return(pom)
dplyr::all_equal(df_sql_1(Posts, Users), df_base_1(Posts, Users))
## [1] TRUE
```

```
df_dplyr_1 <- function(x,y){</pre>
 pos <- filter(Posts,PostTypeId==1)</pre>
 pom <- inner_join(Users,pos,by=c("Id"="OwnerUserId"))</pre>
 data <-group_by(pom,Id) %>%
    summarise(FavoriteTotal = sum(FavoriteCount, na.rm=TRUE), MostFavoriteQuestionLikes=max(FavoriteCount, na.rm=TRUE
   rename(OwnerUserId=Id)
 data <- inner_join(data,pom,by=c("OwnerUserId"="Id")) %>% #niezbedne joiny
    arrange(OwnerUserId, desc(MostFavoriteQuestionLikes)) %>%
    group_by(OwnerUserId) %>% top_n(n=1,wt=FavoriteCount) %>%
    select(DisplayName, Age, Location, FavoriteTotal, Title, MostFavoriteQuestionLikes, OwnerUserId) %>%
    rename(MostFavoriteQuestion=Title) %>% #zgodnosc kolumn
    ungroup() %>% #pozbycie sie factorow
    select(-OwnerUserId) %>%
    arrange(desc(FavoriteTotal)) %>% head(10)
 data$MostFavoriteQuestionLikes <- as.integer(data$MostFavoriteQuestionLikes) #odpowiednie typu kolumn
 data$MostFavoriteQuestion <- as.character(data$MostFavoriteQuestion)</pre>
 return(data)
dplyr::all_equal(df_sql_1(Posts, Users), df_dplyr_1(Posts, Users))
## [1] TRUE
```

```
df_dt_1 <- function(x,y){</pre>
pos <- as.data.table(Posts)[PostTypeId==1]</pre>
maxi <- pos[,max(FavoriteCount,na.rm=TRUE),by=OwnerUserId] #bierzemy maksa oraz sume
sumi <- pos[,sum(FavoriteCount,na.rm=TRUE),by=OwnerUserId]</pre>
colnames(sumi) <- c("OwnerUserId", "FavoriteTotal")</pre>
pom <- merge(pos,maxi,by.x=c("OwnerUserId","FavoriteCount"),by.y=c("OwnerUserId","V1"))</pre>
pom <- merge(pom,sumi,by="OwnerUserId")[,c("OwnerUserId","FavoriteTotal","FavoriteCount","Title")]</pre>
colnames(pom) <- c("OwnerUserId", "FavoriteTotal", "MostFavoriteQuestionLikes", "MostFavoriteQuestion")</pre>
post <- merge(pom, Users, by.x="OwnerUserId", by.y="Id")[order(FavoriteTotal, decreasing = TRUE)][1:10]
post <- post[,c("DisplayName","Age","Location","FavoriteTotal",</pre>
                 "MostFavoriteQuestion", "MostFavoriteQuestionLikes")]
post$MostFavoriteQuestionLikes <- as.integer(post$MostFavoriteQuestionLikes)
post$MostFavoriteQuestion <- as.character(post$MostFavoriteQuestion)</pre>
return(post)
}
dplyr::all_equal(df_sql_1(Posts, Users), df_dt_1(Posts, Users))
## [1] TRUE
```

1.5 Benchmark

Wykonuje benchmark na małej próbce z powodu słabej wydajności mojego komputera, jednakże nie ma to zbyt wielkiego wpływu na jego rzetelność.

```
microbenchmark::microbenchmark(
                                                   base = df_base_1(Posts, Users),
                                                   dplyr=df_dplyr_1(Posts, Users),
                                                    data.table=df_dt_1(Posts, Users),
                                                    sql = df sql 1(Posts, Users), times=10)
## Unit: milliseconds
##
                                                   median
                                  lq
                                           mean
                                                                  uq
##
          base 1466.64794 1756.35613 2904.0894 2725.1277 3500.6723 4795.379
##
         dplyr 2145.78783 2515.30033 3048.7399 2829.7944 3410.1360 5035.259
                62.39767
                            89.71782 441.9593 307.1432 466.8701 1857.646
##
    data.table
##
           sql 663.55614 1087.44950 2152.4872 1874.5345 2714.7396 5608.224
##
   neval
       10
##
       10
##
       10
##
##
       10
```

2.1 SQL

Znajdujemy pytania o najwiekszej licznie pozytywnie ocenionych odpowiedzi.

```
df_sql_2 <- function(x){</pre>
second <- sqldf("SELECT</pre>
 Posts.ID,
 Posts.Title,
 Posts2.PositiveAnswerCount
FROM Posts
JOIN (
 SELECT
    Posts.ParentID,
    COUNT(*) AS PositiveAnswerCount
  FROM Posts
 WHERE Posts.PostTypeID=2 AND Posts.Score>0
 GROUP BY Posts.ParentID) AS Posts2
 ON Posts.ID=Posts2.ParentID
ORDER BY Posts2.PositiveAnswerCount DESC
LIMIT 10")
}
```

2.2 Base

2.3 Dplyr

```
df_dplyr_2 <- function(x){
  tbl <-filter(Posts,PostTypeId==2) %>% filter(Score>0) %>%
    group_by(ParentId) %>%
    summarise(PositiveAnswerCount=n()) #fajna funkcja do liczenia wierszy w danej grupie
  tbl <- inner_join(Posts,tbl,by=c("Id"="ParentId")) %>%
    arrange(desc(PositiveAnswerCount)) %>%
    select(Id,Title,PositiveAnswerCount) %>% #bierzemy co trzeba
    head(n=10)
    return(tbl)
}
all_equal(df_dplyr_2(Posts),df_sql_2(Posts))
## [1] TRUE
```

2.4 DT

```
df_dt_2<- function(x){
  tbl <- as.data.table(Posts)[PostTypeId==2][Score>0][,.(.N),by=.(ParentId)] #mozna fajnie laczyc polecenia
  pos <- as.data.table(Posts) #wczytanie jako data.table daje wiele mozliwosc
  tbl <- merge(tbl,pos,by.x="ParentId",by.y="Id")[order(N,decreasing = TRUE)][1:10][,c("ParentId","Title","N")]
  colnames(tbl) <- c("Id","Title","PositiveAnswerCount")
  return(tbl)
}
all_equal(df_dt_2(Posts),df_sql_2(Posts))
## [1] TRUE</pre>
```

```
microbenchmark::microbenchmark(base=df_base_2(Posts),
                               dplyr=df_dplyr_2(Posts),
                               data.table=df_dt_2(Posts),
                               sql = df_sql_2(Posts),times=10)
## Unit: milliseconds
##
         expr min
                               lq
                                       mean
                                               median
                                                              uq
##
         base 149.04146 157.57984 170.20799 166.43546 185.25425 198.4127
##
         dplyr 82.06254 92.42316 107.38018 95.98864 121.96938 157.7479
##
   data.table 67.06970 73.95622 88.01858 90.14536 96.18941 116.4657
           sql 388.18024 417.19077 465.70697 435.32226 498.45450 623.1942
##
##
   neval
##
      10
##
      10
##
      10
       10
##
```

3.1 SQL

Znajdujemy pytania, które w danym roku otrzymały najwięcej UpVotes.

```
df_sql_3 <- function(x,y){</pre>
sqldf("
SELECT
Posts.Title,
UpVotesPerYear.Year,
MAX(UpVotesPerYear.Count) AS Count
FROM (
SELECT
PostId,
COUNT(*) AS Count,
STRFTIME('%Y', Votes.CreationDate) AS Year
FROM Votes
WHERE VoteTypeId=2
GROUP BY PostId, Year
) AS UpVotesPerYear
JOIN Posts ON Posts.Id=UpVotesPerYear.PostId
WHERE Posts.PostTypeId=1
GROUP BY Year")
}
```

3.2 Base

```
df base 3 <- function(x,y){
date <- as.Date(Votes$CreationDate, format='%Y-%m-%d') #odpowiednie wczytanie daty
date<- as.data.frame(as.numeric(format(date, '%Y')))</pre>
vot <- cbind(Votes,date)</pre>
colnames(vot) <- c("BountyAmount", "CreationDate", "Id", "PostId", "UserId", "VoteTypeId", "Year")</pre>
vot <- vot[vot$VoteTypeId==2,]</pre>
vot <- as.data.frame(table(Count = vot[,c("PostId","Year")]),stringsAsFactors = F)</pre>
pos <- Posts[Posts$PostTypeId==1,]</pre>
vot1 <- merge(vot,pos,by.x="PostId",by.y="Id")</pre>
vot <- aggregate(vot1$Freq,list(vot1$Year),FUN=max) #agregowanie danych</pre>
colnames(vot) <- c("Year", "Count")</pre>
vot <- merge(vot,vot1,by.x=c("Year","Count"),by.y=c("Year","Freq"))</pre>
vot <- vot[,c("Year","Title","Count")]</pre>
vot \leftarrow vot[,c(2,1,3)]
vot$Count <- as.integer(vot$Count) #typ kolumn</pre>
return(vot)
dplyr::all_equal(df_sql_3(Posts, Votes), df_base_3(Posts, Votes))
## [1] TRUE
```

```
df_dplyr_3 <- function(x,y){</pre>
date <- as.Date(Votes$CreationDate, format='%Y-%m-%d')
date<- as.data.frame(as.numeric(format(date, '%Y')))</pre>
vot <- cbind(Votes,date)</pre>
colnames(vot) <- c("BountyAmount", "CreationDate", "Id",</pre>
                    "PostId", "UserId", "VoteTypeId", "Year")
pom <- filter(vot, VoteTypeId==2) %% group_by(PostId) %>% select(PostId, Year)
vot <- filter(vot, VoteTypeId==2) %% group_by(PostId, Year) %>% summarise(Count = n())
vot <- inner_join(vot,pom,by="PostId")</pre>
pos <- filter(Posts, PostTypeId==1) #wybieramy co trzeba
vot1 <- inner_join(vot,pos,by=c("PostId"="Id")) %>% select(Title,Count,Year.x,PostId)
vot <- ungroup(vot1) #znow te facotry</pre>
vot <- distinct(vot, .keep_all = TRUE) %>% group_by(Year.x) %>% summarise(Count=max(Count))
vot <- inner_join(vot,vot1,by=c("Year.x"="Year.x","Count"="Count"))</pre>
vot <- distinct(vot, .keep_all = TRUE) %>% select(Year.x,Count,Title)#bierzemy unikalne
colnames(vot) <- c("Year", "Count", "Title")</pre>
vot$Count <- as.integer(vot$Count)</pre>
vot$Year <- as.character(vot$Year)</pre>
return(vot)
}
dplyr::all_equal(df_sql_3(Posts, Votes), df_dplyr_3(Posts, Votes))
## [1] TRUE
```

```
df_dt_3 <- function(x,y){</pre>
date <- as.Date(Votes$CreationDate, format='%Y-%m-%d')
date<- as.data.frame(as.numeric(format(date, '%Y')))</pre>
vot <- cbind(Votes,date) #laczymy date z reszta tabeli</pre>
colnames(vot) <- c("BountyAmount", "CreationDate", "Id", "PostId", "UserId", "VoteTypeId", "Year")</pre>
vot <- as.data.table(vot)[VoteTypeId==2][, .(Count = .N), by = .(PostId, Year)]</pre>
pos <- as.data.table(Posts)[PostTypeId==1] #odpowiednie wczytanie
vot1 <- merge(vot,pos,by.x="PostId",by.y="Id")</pre>
vot <- vot1[,max(Count),by=Year]</pre>
vot <- merge(vot,vot1,by.x=c("Year","V1"),by.y=c("Year","Count"))[,c("Title","Year","V1")]</pre>
names(vot)[names(vot) == "V1"] = "Count" #odpowiednia nazwa
vot$Year <- as.character(vot$Year)</pre>
return(vot)
}
dplyr::all_equal(df_sql_3(Posts, Votes), df_dt_3(Posts, Votes))
## [1] TRUE
```

```
microbenchmark::microbenchmark(base=df_base_3(Posts, Votes),
                              dplyr=df_dplyr_3(Posts, Votes),
                              data.table=df_dt_3 (Posts, Votes), times=10)
## Unit: milliseconds
##
                                             median
                                                                   max neval
         expr
                  min
                              lq
                                      mean
                                                           uq
##
          base 2540.2819 2648.167 2716.6483 2697.487 2793.4248 2995.115 10
##
         dplyr 1411.2981 1428.186 1529.0191 1530.322 1605.9465 1648.394
                                                                          10
##
   data.table 689.6859 811.772 851.2928 855.296 887.0114 1033.180
                                                                          10
```

4.1 SQL

Znajdujemy pytania, gdzie wystąpiła największa różnica pomiędzy najwyżej oceniona odpowiedzią, a odpowiedzią oznaczoną jako Accepted Answer.

```
df_sql_4 <-function(x){</pre>
sqldf("SELECT
 Questions.Id,
 Questions.Title,
 BestAnswers.MaxScore,
 Posts.Score AS AcceptedScore,
 BestAnswers.MaxScore-Posts.Score AS Difference
FROM (
SELECT Id, ParentId, MAX(Score) AS MaxScore
 FROM Posts
 WHERE PostTypeId==2
 GROUP BY ParentId
 ) AS BestAnswers
JOIN (
SELECT * FROM Posts
WHERE PostTypeId==1
) AS Questions
ON Questions.Id=BestAnswers.ParentId
JOIN Posts ON Questions.AcceptedAnswerId=Posts.Id
WHERE Difference>50
ORDER BY Difference DESC")
```

4.2 Base

```
df base 4 <- function(x){</pre>
  BestAnswers <- Posts[Posts$PostTypeId==2,c("Id","ParentId","Score")]</pre>
  BestAnswers1 <- aggregate(Score~ParentId, BestAnswers, max, na.rm=T)
  BestAnswers2 <- merge(BestAnswers1,BestAnswers,all=F) #odpowiedni merge
  BestAnswers2 <- BestAnswers2[order(BestAnswers2$ParentId,BestAnswers2$Id),]
  BestAnswers2 <- BestAnswers2[!duplicated(BestAnswers2$ParentId),] #pozbycie sie duplikatow
  colnames(BestAnswers2) <- c("ParentId", "MaxScore", "Idx")</pre>
  Questions <- Posts[Posts$PostTypeId==1,]
  wynik <- merge(Questions, BestAnswers2, by . x="Id", by . y="ParentId")</pre>
  wynik <- merge(wynik,Posts,by.x="AcceptedAnswerId",by.y="Id")</pre>
  wynik$Diffrence <- wynik$MaxScore - wynik$Score.y
  wynik <- wynik[wynik$Diffrence>50,] #wybranie tych z roznica powyzej 50
  wynik <- wynik[order(wynik$Diffrence, decreasing = TRUE),]</pre>
  wynik <- wynik[,c("Id","Title.x","MaxScore","Score.y","Diffrence")]</pre>
  colnames(wynik) <- c("Id", "Title", "MaxScore",</pre>
                        "AcceptedScore", "Difference") #pasujace tytuly kolumm
return(wynik)
}
dplyr::all_equal(df_sql_4(Posts), df_base_4(Posts))
## [1] TRUE
```

```
df_dplyr_4 <- function(x){</pre>
 pom <- filter(Posts,PostTypeId==2) %>% group_by(ParentId) %>% summarise(MaxScore = max(Score))
 pos <- filter(Posts,PostTypeId==2)</pre>
 pom <- inner_join(pom,pos,by=c("ParentId"="ParentId", "MaxScore"="Score")) %>%
    arrange(ParentId,Id) %>%
    filter(!duplicated(ParentId,Id)) %>% select(Id,ParentId,MaxScore) #fajne laczenie polecen pipe'ami
  post <- filter(Posts,PostTypeId==1)</pre>
  wynik <- inner_join(post,pom,by=c("Id"="ParentId")) #laczenie ramek</pre>
  wynik <- inner_join(wynik,Posts,by=c("AcceptedAnswerId"="Id")) %>%
    select("Id", "Title.x", "MaxScore", "Score.y") %>%
    mutate(Difference=MaxScore-Score.y) %>% #kolumna z roznica
    arrange(desc(Difference)) %>% filter(Difference>50) %>% rename(Title=Title.x,AcceptedScore=Score.y)
  wynik$MaxScore <- as.integer(wynik$MaxScore) #odpowiedni output</pre>
  wynik$Difference <- as.integer(wynik$Difference)</pre>
  return(wynik)
dplyr::all_equal(df_sql_4(Posts),df_dplyr_4(Posts))
## [1] TRUE
```

4.4 DT

```
df_dt_4 <- function(x){</pre>
tbl <- as.data.table(Posts)[PostTypeId==2]
tb <- tbl[,.(MaxScore=max(Score)),by=ParentId] #agregacja po parentId
wynik <- merge(tb,tbl,by.x=c("ParentId","MaxScore"),by.y=c("ParentId","Score"))</pre>
wynik <- wynik[order(ParentId,Id)][!duplicated(ParentId)]</pre>
pos <- as.data.table(Posts)[PostTypeId==1] #odpowiednie wybranie danych
post <- as.data.table(Posts)</pre>
wynik <- merge(wynik,pos,by.x="ParentId",by.y="Id")[,.(MaxScore,ParentId,Title.y,AcceptedAnswerId.y)]
names(wynik) [names(wynik) == "ParentId"] = "Id" #zmiana nazwy jednej kolumny
wynik <- merge(wynik,post,by.x="AcceptedAnswerId.y",by.y="Id")[,.(Id,Title.y,MaxScore,Score)]
wynik <- wynik[,.((Difference=MaxScore-Score),Title.y,MaxScore,Score,Id)][V1>50][order(-V1)]
#wybieramy co trzeba
colnames(wynik) <- c("Difference", "Title", "MaxScore", "AcceptedScore", "Id")</pre>
return(wynik)
}
dplyr::all_equal(df_sql_4(Posts),df_dt_4(Posts))
## [1] TRUE
```

```
microbenchmark::microbenchmark(base=df_base_4(Posts),
                               dplyr=df_dplyr_4(Posts),
                               data.table=df_dt_4(Posts),
                               sql = df_sql_4(Posts),times=10)
## Unit: milliseconds
##
         expr min
                               lq
                                       mean
                                               median
                                                              uq
##
         base 471.26275 481.92161 511.07402 505.39743 510.92871 629.2353
##
         dplyr 196.77372 199.18798 211.57017 206.72323 225.36426 235.2425
##
   data.table 67.62245 67.87531 91.61025 95.74571 99.26295 152.8045
          sql 325.66064 326.67624 328.79016 329.09962 330.14763 331.6815
##
##
   neval
      10
##
##
      10
      10
##
       10
##
```

5.1 SQL

```
df_sql_5<-function(x){</pre>
sqldf("SELECT
 Posts.Title,
  CmtTotScr.CommentsTotalScore
FROM (
 SELECT
 PostID,
 UserID,
 SUM(Score) AS CommentsTotalScore
 FROM Comments
GROUP BY PostID, UserID
) AS CmtTotScr
JOIN Posts ON Posts.ID=CmtTotScr.PostID AND Posts.OwnerUserId=CmtTotScr.UserID
WHERE Posts.PostTypeId=1
ORDER BY CmtTotScr.CommentsTotalScore DESC
LIMIT 10")
}
```

Otrzymujemy pytania do których komentarze dodane przez samego pytającego miały sumarycznie najwyższą ocenę.

5.2 Base

```
df_base_5 <- function(x){
    x <- Comments[,c("PostId","UserId")] #kod nie wymaga w tym przypadku wielkich komentarzy
    tym <- aggregate(Comments[,"Score"],by=x,FUN=sum)
    colnames(tym) <- c("PostId","UserId","CommentsTotalScore")
    tym1 <- merge(tym,Posts,by.x=c("PostId","UserId"),by.y=c("Id","OwnerUserId"))
    tym1 <- tym1[tym1$PostTypeId==1,]
    tym1 <- tym1[order(tym1$CommentsTotalScore,decreasing = TRUE),]
    tym1 <- tym1[c(1:10),c("Title","CommentsTotalScore")]
    return(tym1)
}
dplyr::all_equal(df_sql_5(Posts),df_base_5(Posts))</pre>
## [1] TRUE
```

```
df_dplyr_5 <- function(x){
pom <- group_by(Comments,PostId,UserId) %>% summarise(x = sum(Score)) %>%
    rename(CommentsTotalScore = x)
pos <- filter(Posts,PostTypeId==1)
pom <- inner_join(pom,pos, by=c("PostId"="Id","UserId"="OwnerUserId")) %>%
    arrange(desc(CommentsTotalScore))
pom <- ungroup(pom) #pozbycie sie kolumny po ktorej grupowalismy
pom <- pom[1:10,] %>% select(Title,CommentsTotalScore)
return(pom)
}
dplyr::all_equal(df_sql_5(Posts),df_dplyr_5(Posts))
## [1] TRUE
```

5.4 DT

```
df_dt_5 <- function(x){
tb <- as.data.table(Comments)
pos <- as.data.table(Posts)[PostTypeId==1]
tb <- tb[,.(CommentsTotalScore=sum(Score)),by=c("PostId","UserId")]
tb <- merge(tb,pos,by.x=c("PostId","UserId"),by.y=c("Id","OwnerUserId"))
tb <- tb[,.(Title,CommentsTotalScore)][order(CommentsTotalScore,decreasing = TRUE)][1:10]
return(tb)
}
dplyr::all_equal(df_sql_5(Posts),df_dt_5(Posts))
## [1] TRUE</pre>
```

```
microbenchmark::microbenchmark(base=df_base_5(Posts),
                            dplyr=df_dplyr_5(Posts),
                            data.table=df_dt_5(Posts),
                            sql = df_sql_5(Posts),times=10)
## Unit: milliseconds
        expr min lq
##
                                    mean
                                             median
##
        base 2438.2630 2495.44441 2578.58173 2531.39248 2665.18204
##
        dplyr 235.9695 265.67208 278.18029 273.94557 287.69707
  data.table 40.8855 41.83313 43.38918 42.23522 43.94918
##
        sql 599.9890 601.68722 614.08697 604.59197 607.32518
##
         max neval
##
##
  2791.82005 10
##
   349.32556
              10
##
    51.29104
               10
##
  672.37690
              10
```

6.1 SQL

Informacje o użytkownikach, którym odznakę klasy pierwszej przyznano od 2 do 10 razy.

```
df_sql_6 <- function(x,y){</pre>
sqldf("SELECT DISTINCT
  Users.Id,
  Users.DisplayName,
 Users.Reputation,
  Users.Age,
 Users.Location
FROM (
    SELECT
      Name, UserID
      FROM Badges
    WHERE Name IN (
      SELECT
       Name
      FROM Badges
      WHERE Class=1
      GROUP BY Name
      HAVING COUNT(*) BETWEEN 2 AND 10
  AND Class=1
) AS ValuableBadges
JOIN Users ON ValuableBadges.UserId=Users.Id")
```

6.2 Base

```
df_base_6 <- function(x,y){</pre>
tym <- Badges[Badges$Class==1,]
tym <- as.data.frame(tym$Name)</pre>
tym <- as.data.frame(table(tym)) #tabela kontyngencji jako ramka danych
tym <- tym[tym$Freq>=2,]
tym <- tym[tym$Freq<=10,]</pre>
tym1 <- Badges[Badges$Class==1,]
tym1 <- tym1[,c("UserId","Name")]</pre>
tym <- merge(tym,tym1,by.x="tym",by.y="Name")</pre>
wynik <- merge(tym, Users, by.x="UserId", by.y="Id") #odpowiedni merge
wynik <- wynik[,c("UserId","Reputation","DisplayName","Age","Location")]</pre>
wynik <- wynik[!duplicated(wynik),] #pozbycie sie duplikatow</pre>
colnames(wynik) <- c("Id", "Reputation", "DisplayName", "Age", "Location")</pre>
return(wynik)
}
dplyr::all_equal(df_sql_6(Users, Badges), df_base_6(Users, Badges))
## [1] TRUE
```

6.3 Dplyr

```
df_dplyr_6 <- function(x,y) {
    x <- filter(Badges,Class==1) %>% group_by(Name) %>%
        summarise(count=n()) %>% filter(count>=2) %>%
        filter(count<=10) #grupowanie i ograniczenie count
y <- filter(Badges,Class==1, Name %in% x$Name) %>% select(Name,UserId)
z <- inner_join(y,Users,by=c("UserId"="Id")) %>%
        select(UserId,DisplayName,Reputation,Age,Location) #laceenie ramek
colnames(z) <- c("Id","DisplayName","Reputation","Age","Location")
z <- unique(z) #unikalne
return(z)
}
dplyr::all_equal(df_sql_6(Users,Badges),df_dplyr_6(Users,Badges))
## [1] TRUE</pre>
```

6.4 DT

```
df_dt_6 <- function(x,y){
tbl <- as.data.table(Badges)
tbl <- tbl[Class==1][,.(.N),by= .(Name)][N<=10][N>=2] #znow ladny syntax do laczenia polecen
pom <- as.data.table(Badges)[Class==1][Name %in%tbl$Name][,.(Name,UserId)]
pom <- merge(pom,Users,by.x="UserId",by.y="Id")
pom <- pom[,.(UserId,DisplayName,Reputation,Age,Location)][!duplicated(DisplayName)]
#wybranie odpowiednich kolumn
setnames(pom,old="UserId",new="Id")
return(pom)
}
dplyr::all_equal(df_sql_6(Users,Badges),df_dt_6(Users,Badges))
## [1] TRUE</pre>
```

```
microbenchmark::microbenchmark(base=df_base_6(Users,Badges),
                              data.table=df_dt_6(Users, Badges),
                              dplyr=df_dplyr_6(Users, Badges),
                              sql = df_sql_6(Users, Badges), times=10)
## Unit: milliseconds
##
          expr
                 min
                               lq
                                       mean
                                               median
                                                             uq
##
          base 11.59680 11.63181 12.08182 11.84501 12.31503 13.19261
##
   data.table 16.67658 16.88538 17.20026 17.03064 17.40674 18.68102
##
         dplyr 27.88332 28.07257 32.74459 31.07745 32.59981 52.88410
           sql 291.45809 294.08060 298.26669 295.94331 298.78827 320.25213
##
##
    neval
       10
##
##
       10
       10
##
       10
##
```

7.1 SQL

Otrzymujemy pytania, które przed 2016 otrzymały najwięcej UpVotes.

```
df_sql_7 <- function(x,y){sqldf("SELECT</pre>
Posts.Title,
VotesByAge2.OldVotes
FROM Posts
JOIN (
SELECT
PostId,
MAX(CASE WHEN VoteDate = 'new' THEN Total ELSE O END) NewVotes,
MAX(CASE WHEN VoteDate = 'old' THEN Total ELSE 0 END) OldVotes,
SUM(Total) AS Votes
FROM (
SELECT
PostId,
CASE STRFTIME('%Y', CreationDate)
WHEN '2017' THEN 'new'
WHEN '2016' THEN 'new'
ELSE 'old'
END VoteDate,
COUNT(*) AS Total
FROM Votes
WHERE VoteTypeId=2
GROUP BY PostId, VoteDate
) AS VotesByAge
GROUP BY VotesByAge.PostId
HAVING NewVotes=0
) AS VotesByAge2 ON VotesByAge2.PostId=Posts.ID
WHERE Posts.PostTypeId=1
ORDER BY VotesByAge2.OldVotes DESC
LIMIT 10")
```

```
df_base_7 <- function(x,y){</pre>
  Votes2 <- Votes[Votes$VoteTypeId==2,]</pre>
  Year <- as.data.frame(substring(Votes2$CreationDate, 1, 4))</pre>
  OLdNew <- Year
  OLdNew <- as.data.frame(ifelse(Year=="2017" | Year=="2016", "new", "old"))
  VotesByAge0 <- cbind(Votes2[, c("PostId")], OLdNew)</pre>
  colnames(VotesByAge0) <- c("PostId", "VoteDate")</pre>
  VotesByAge <- as.data.frame(table(VotesByAge0))</pre>
  VotesByAge <- VotesByAge[VotesByAge$Freq>0,] #wybranie tych powyzej 0
  VotesByAge <- VotesByAge[order(VotesByAge$PostId),]</pre>
  rownames(VotesByAge) <- NULL</pre>
  colnames(VotesByAge)[3] <- "Total" #dobre nazwy kolumn</pre>
  VotesByAge["PostId"] <- as.numeric(levels(VotesByAge$PostId))[VotesByAge$PostId] #odpowiednia postac
  VotesByAge["VoteDate"] <- as.character(levels(VotesByAge$VoteDate))[VotesByAge$VoteDate]</pre>
  Votes3 <- aggregate(VotesByAge$Total, VotesByAge["PostId"], sum)[2]</pre>
  VotesByAgeOld <- VotesByAge[VotesByAge$VoteDate=="old",]</pre>
  OldMaxes <- aggregate(VotesByAgeOld[,"Total"], VotesByAgeOld["PostId"], max)
  colnames(OldMaxes)[2] <- "OldVotes"</pre>
  VotesByAgeNew <- VotesByAge[VotesByAge$VoteDate=="new",] #wybranie odpowiednich danych
  NewMaxes <- aggregate(VotesByAgeNew[, "Total"], VotesByAgeNew["PostId"], max)
  colnames(NewMaxes)[2] <- "NewVotes"</pre>
  Maxes <- merge(NewMaxes, OldMaxes, by.x = "PostId", by.y="PostId", T, T)
  Maxes <- Maxes[order(Maxes$PostId),]</pre>
  Maxes <- cbind(Maxes, Votes3) #laczymy wyniki
  colnames(Maxes)[4] <- "Votes"</pre>
  Maxes[is.na(Maxes$NewVotes), "NewVotes"] <- 0 #pozbywamy sie NA zamieniejac je na 0
  VotesByAge2 <- Maxes[Maxes$NewVotes==0,]</pre>
  Posts1 <- Posts[Posts$PostTypeId==1,]
  datas<- merge(Posts1, VotesByAge2, by.x="Id", by.y="PostId")</pre>
  out <- datas[, c("Title", "OldVotes")]</pre>
  out <- out[order(out$0ldVotes, decreasing = T),]</pre>
  out <- head(out, 10)</pre>
  return(out)
dplyr::all_equal(df_sql_7(),df_base_7())
## [1] TRUE
```

7.3 Dplyr

```
df_dplyr_7 <- function(x,y){</pre>
Votes2 <- filter(Votes, VoteTypeId==2)</pre>
Year <- as.data.frame(substring(Votes2$CreationDate, 1, 4))</pre>
VoteDate <- ifelse(Year=="2017" | Year=="2016", "new", "old")
#case_when jest znacznie wolniejsze
mutate(Votes2, VoteDate) %>%
  group_by(PostId, VoteDate)%>%
  summarise(Total =n()) -> VotesByAge #suma po odpowiednich grupach
VotesByAge%>%
 filter(VoteDate=="old") %>%
  group_by(PostId) %>%
 mutate(OldVotes = max(Total)) -> dt1 #nowa kolumna
VotesByAge%>%
 filter(VoteDate=="new") %>%
  group_by(PostId) %>% #grupujemy
 mutate(NewVotes = max(Total)) -> dt2
merge(dt1, dt2, by="PostId", all=T)%>%
  select(PostId, NewVotes, OldVotes) -> pom #wybranie tego co wazne
  mutate(NewVotes = replace(NewVotes, is.na(NewVotes), 0)) %>%
  mutate(OldVotes = replace(OldVotes, is.na(OldVotes), 0)) -> pomoc
pomoc %>%
 mutate(Votes = OldVotes) %>%
  filter(NewVotes ==0) -> VT
out <- filter(Posts, PostTypeId ==1) %>%
 inner_join(VT, by=c("Id" = "PostId"))%>%
  select(Title, OldVotes) %>%
  arrange(desc(OldVotes)) %>% #odpowiednio sortujemy
 head(10)
out$0ldVotes <- as.integer(out$0ldVotes)</pre>
return(out)
dplyr::all_equal(df_sql_7(Posts, Votes), df_dplyr_7(Posts, Votes))
## [1] TRUE
```

7.4 DT

```
df_dt_7 \leftarrow function(x,y){
Votes <- as.data.table(Votes)</pre>
Posts <- as.data.table(Posts)</pre>
Votes2 <- Votes[VoteTypeId==2]</pre>
Year <- setDT(data.frame(substring(Votes2$CreationDate, 1, 4)))</pre>
colnames(Year) <- "colYear"#ustawienie nazwy</pre>
VoteDate <- Year[colYear%in% c("2017", "2016"), OldNew := "New"] #wybranie odpowiednio new i old
VoteDate <- Year[!colYear%in% c("2017", "2016"), OldNew := "Old"]
VotesByAge <- cbind(Votes2, VoteDate = VoteDate[, OldNew])[, .N, keyby=.(PostId, VoteDate)]
VotesByAge[, "Total" := sum(N), PostId][VoteDate=="New", "NewVotes" := max(N), PostId][VoteDate=="Old", "OldVotes"
[Total==OldVotes, .(NewVotes, OldVotes, Total), PostId ] -> VotesByAge2 #wyqodne ustawienie zmiennej
setkey(VotesByAge2, PostId)
setkey(Posts, Id)
data <- Posts[VotesByAge2, nomatch=0]</pre>
out <- data[PostTypeId==1, .(Title, OldVotes)] #wybranie odpowiednich</pre>
out <- out[order(-OldVotes)][1:10]</pre>
return(out)
dplyr::all_equal(df_sql_7(Posts, Votes), df_dt_7(Posts, Votes))
## [1] TRUE
```

7.5 Benchmark

```
microbenchmark::microbenchmark(base=df_base_7(Posts, Votes),
                               data.table=df_dt_7(Posts, Votes),
                               dplyr=df_dplyr_7(Posts, Votes),
                               sql = df_sql_7(Posts, Votes), times=10)
## Unit: milliseconds
##
                                                    median
          expr
                     min
                                 lq
                                          mean
                                                                   uq
##
          base 2111.0692 2186.7692
                                     2423.7930
                                                2351.1971
                                                           2667.2067
##
    data.table 294.6868
                          358.2996
                                      507.4591
                                                  531.9952
##
         dplyr 8841.2082 10012.9089 11700.7655 11017.2935 12289.1902
##
           sql 1330.4123 1392.5078 1572.8476 1487.0263 1761.7492
##
           max neval
     2912.8770
##
                  10
##
      831.4758
                  10
##
    19286.1066
                  10
##
     2027.5478
                10
```

Niejako podsumowując prędkość dzialania data.
table, dplyr oraz bazowego R nasuwa się dość jasny obraz prędkości ich dział
ąnia. Data.
table jest w zdecydowanej większości przypadków najszybszy, ale dplyr bije go na głowę pod względem łatwości w użyciu oraz prostocie kodu który się w nim pisze.