HomeWork1

Viveksinh

2/18/2020

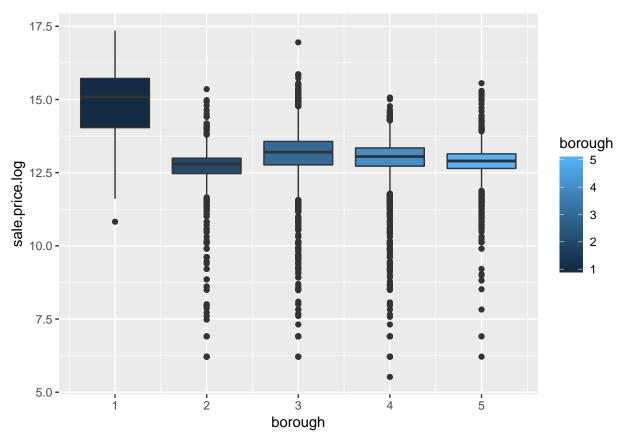
```
install.packages("doBy")
```

Problem 1

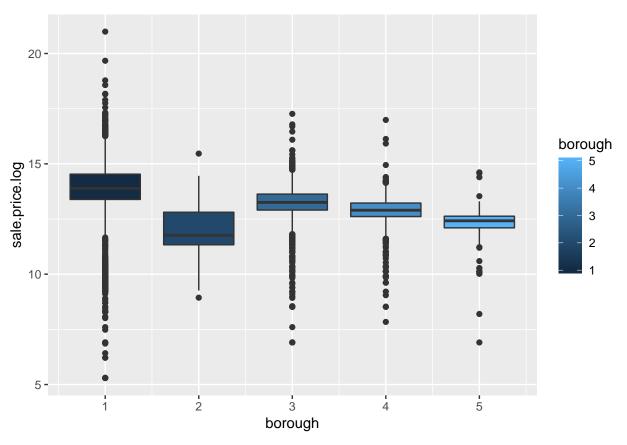
```
rm(list = ls())
setwd('E:/STEVENS/study/FE-582/assignments/asst1/HW1_S20')
## [1] "E:/STEVENS/study/FE-582/assignments/asst1/HW1_S20"
library('xlsx')
library('gdata')
## gdata: read.xls support for 'XLS' (Excel 97-2004) files ENABLED.
##
## gdata: read.xls support for 'XLSX' (Excel 2007+) files ENABLED.
##
## Attaching package: 'gdata'
## The following object is masked from 'package:stats':
##
##
## The following object is masked from 'package:utils':
##
##
       object.size
## The following object is masked from 'package:base':
##
##
       startsWith
# Load datasets
bk <- read.xls("rollingsales_brooklyn.xls",perl = "C:\\Perl64\\bin\\perl.exe", pattern="BOROUGH")
bx <- read.xls("rollingsales_bronx.xls",perl = "C:\\Perl64\\bin\\perl.exe", pattern="BOROUGH")</pre>
manh <- read.xls("rollingsales_manhattan.xls",perl = "C:\\Perl64\\bin\\perl.exe", pattern="BOROUGH")</pre>
qn <- read.xls("rollingsales_queens.xls",perl = "C:\\Perl64\\bin\\perl.exe", pattern="BOROUGH")</pre>
si <- read.xls("rollingsales_statenisland.xls",perl = "C:\Perl64\bin\perl.exe", pattern="BOROUGH")</pre>
# convert column names to lowercase
names(bk) <- tolower(names(bk))</pre>
names(bx) <- tolower(names(bx))</pre>
```

```
names(manh) <- tolower(names(manh))</pre>
names(qn) <- tolower(names(qn))</pre>
names(si) <- tolower(names(si))</pre>
# Format
# Brooklyn
bk$sale.price.n <- as.numeric(gsub("[^[:digit:]]","",bk$sale.price))</pre>
bk$gross.sqft <- as.numeric(gsub("[^[:digit:]]","",bk$gross.square.feet))</pre>
bk$land.sqft <- as.numeric(gsub("[^[:digit:]]","",bk$land.square.feet))</pre>
bk$sale.date <- as.Date(bk$sale.date)</pre>
bk$year.built <- as.numeric(as.character(bk$year.built))</pre>
# Bronx
bx$sale.price.n <- as.numeric(gsub("[^[:digit:]]","",bx$sale.price))</pre>
bx$gross.sqft <- as.numeric(gsub("[^[:digit:]]","",bx$gross.square.feet))</pre>
bx$land.sqft <- as.numeric(gsub("[^[:digit:]]","",bx$land.square.feet))</pre>
bx$sale.date <- as.Date(bx$sale.date)</pre>
bx$year.built <- as.numeric(as.character(bx$year.built))</pre>
# Manhattan
manh$sale.price.n <- as.numeric(gsub("[^[:digit:]]","",manh$sale.price))</pre>
manh$gross.sqft <- as.numeric(gsub("[^[:digit:]]","",manh$gross.square.feet))</pre>
manh$land.sqft <- as.numeric(gsub("[^[:digit:]]","",manh$land.square.feet))</pre>
manh$sale.date <- as.Date(manh$sale.date)</pre>
manh$year.built <- as.numeric(as.character(manh$year.built))</pre>
# Queens
qn$sale.price.n <- as.numeric(gsub("[^[:digit:]]","",qn$sale.price))</pre>
qn$gross.sqft <- as.numeric(gsub("[^[:digit:]]","",qn$gross.square.feet))</pre>
qn$land.sqft <- as.numeric(gsub("[^[:digit:]]","",qn$land.square.feet))</pre>
qn$sale.date <- as.Date(qn$sale.date)</pre>
qn$year.built <- as.numeric(as.character(qn$year.built))</pre>
# StatenIsland
si$sale.price.n <- as.numeric(gsub("[^[:digit:]]","",si$sale.price))</pre>
```

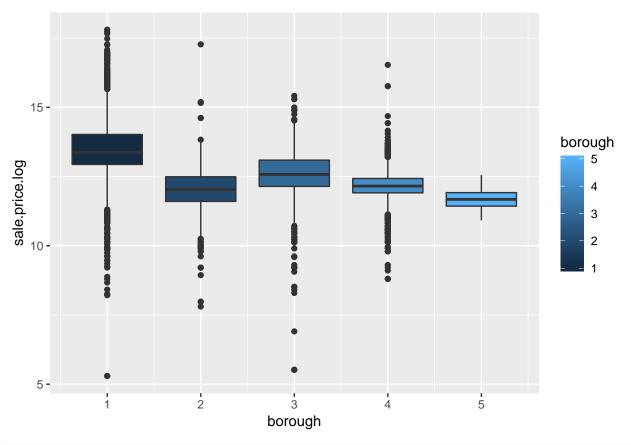
```
si$gross.sqft <- as.numeric(gsub("[^[:digit:]]","",si$gross.square.feet))</pre>
si$land.sqft <- as.numeric(gsub("[^[:digit:]]","",si$land.square.feet))</pre>
si$sale.date <- as.Date(si$sale.date)</pre>
si$year.built <- as.numeric(as.character(si$year.built))</pre>
# Clean: remove records which don't have sale price(=0$)
bk <- bk[bk$sale.price.n!=0,]</pre>
bx <- bx[bx$sale.price.n!=0,]</pre>
manh <- manh[manh$sale.price.n!=0,]</pre>
qn <- qn[qn$sale.price.n!=0,]</pre>
si <- si[si$sale.price.n!=0,]</pre>
# remove outliers
bk$sale.price.log <- log(bk$sale.price.n)</pre>
bk <- bk[bk$sale.price.log > 5, ]
bx$sale.price.log <- log(bx$sale.price.n)</pre>
bx <- bx[bx$sale.price.log > 5, ]
manh$sale.price.log <- log(manh$sale.price.n)</pre>
manh <- manh[manh$sale.price.log > 5, ]
qn$sale.price.log <- log(qn$sale.price.n)</pre>
qn <- qn[qn$sale.price.log > 5, ]
si$sale.price.log <- log(si$sale.price.n)</pre>
si <- si[si$sale.price.log > 5, ]
## Comparison and analysis across boroughs
## Family
homes_borough_1 <- bk[which(grepl("FAMILY",bk$building.class.category)),]
homes_borough_2 <- bx[which(grepl("FAMILY",bx$building.class.category)),]
homes_borough_3 <- manh[which(grepl("FAMILY",manh$building.class.category)),]
homes_borough_4 <- qn[which(grepl("FAMILY",qn$building.class.category)),]
homes_borough_5 <- si[which(grep1("FAMILY",si$building.class.category)),]</pre>
final_homes_table <- rbind(homes_borough_1, homes_borough_2, homes_borough_3, homes_borough_4, homes_bo
library("ggplot2")
ggplot(final_homes_table,aes(x=borough, y=sale.price.log, fill=borough, group=borough))+geom_boxplot()
```



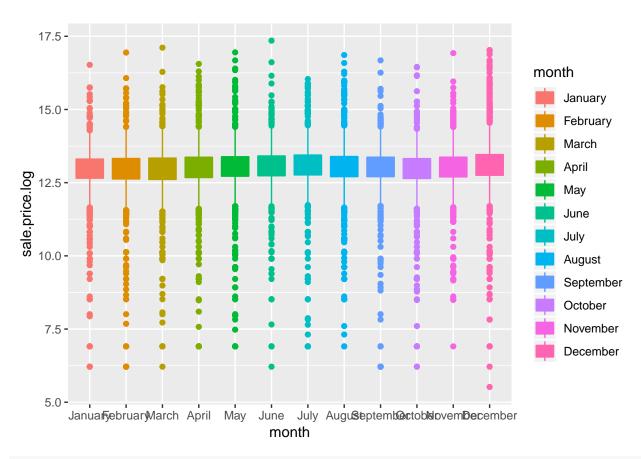
```
## Condos
condos_borough_1 <- bk[which(grepl("CONDOS",bk$building.class.category)),]
condos_borough_2 <- bx[which(grepl("CONDOS",bx$building.class.category)),]
condos_borough_3 <- manh[which(grepl("CONDOS",manh$building.class.category)),]
condos_borough_4 <- qn[which(grepl("CONDOS",qn$building.class.category)),]
condos_borough_5 <- si[which(grepl("CONDOS",si$building.class.category)),]
final_condos_table <- rbind(condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_1, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_3, condos_borough_4, condos_borough_2, condos_borough_3, condos_borough_4, condos_borough_3, condos_borough_4, condos_borough_3, condos_borough_4, condos_borough_4, condos_borough_3, condos_borough_3, condos_borough_4, condos_borough_4, condos_borough_3, condos_borough_4, cond
```

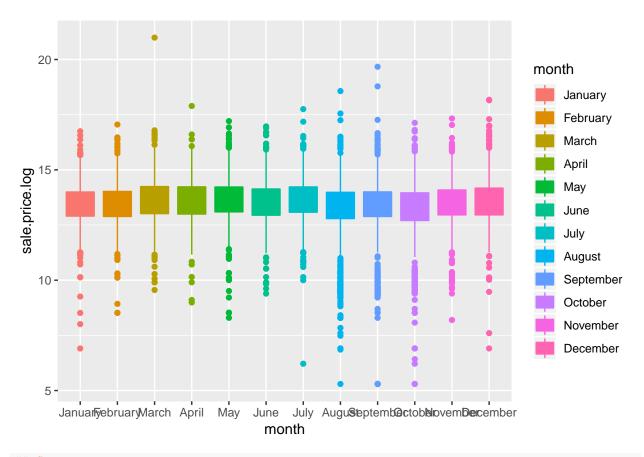


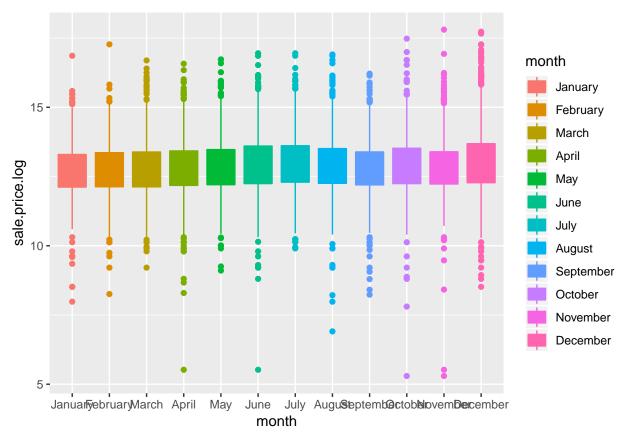
```
## Coops
coops_borough_1 <- bk[which(grep1("COOPS",bk$building.class.category)),]
coops_borough_2 <- bx[which(grep1("COOPS",bx$building.class.category)),]
coops_borough_3 <- manh[which(grep1("COOPS",manh$building.class.category)),]
coops_borough_4 <- qn[which(grep1("COOPS",qn$building.class.category)),]
coops_borough_5 <- si[which(grep1("COOPS",si$building.class.category)),]
final_coops_table <- rbind(coops_borough_1, coops_borough_2, coops_borough_3, coops_borough_4, coops_borough_5)
ggplot(final_coops_table,aes(x=borough, y=sale.price.log, fill=borough, group=borough))+geom_boxplot()</pre>
```



```
## Comparison and analysis across time
# convert date format to days and months
days_month <- function(df){</pre>
  df$day <- format(df$sale.date, "%A")</pre>
  df$day <- factor(df$day, levels = c("Monday", 'Tuesday',</pre>
                                         "Wednesday", "Thursday", "Friday"))
  df$month <- format(df$sale.date, "%B")</pre>
  df$month <- factor(df$month, levels = c("January", "February", "March",</pre>
                                             "April", "May", "June", "July", "August",
                                             "September", "October", "November",
                                             "December"))
  return(df)
}
final_homes_table_time_transformation <- days_month(final_homes_table)</pre>
final_condos_table_time_transformation <- days_month(final_condos_table)</pre>
final_coops_table_time_transformation <- days_month(final_coops_table)</pre>
## Family homes
ggplot(final_homes_table_time_transformation,aes(x=month, y=sale.price.log,
                                                     fill=month, group=month, colour=month)) + geom_boxplo
```







```
library("doBy")
siterange <- function(x){c(length(x),mean(x),median(x))}</pre>
## Summary statistics across boroughs
# Family homes
summaryBy(borough+sale.price+gross.sqft~building.class.category, data=final_homes_table, FUN=siterange)
##
                           building.class.category borough.FUN1 borough.FUN2
                                                                      3.861126
## 1 01
         ONE FAMILY HOMES
                                                            9433
## 2 02
         TWO FAMILY HOMES
                                                            7995
                                                                      3.426517
## 3 03 THREE FAMILY HOMES
                                                            2166
                                                                      3.091874
##
     borough.FUN3 sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
                              9433
                                          2302.324
## 2
                3
                              7995
                                          2330.967
                                                               2082
## 3
                3
                              2166
                                          2185.910
                                                               2082
     gross.sqft.FUN1 gross.sqft.FUN2 gross.sqft.FUN3
## 1
                9433
                             1710.353
                                                  1520
## 2
                7995
                             2327.915
                                                  2200
## 3
                2166
                             3124.282
                                                  3060
```

Condos

summaryBy(borough+sale.price+gross.sqft~building.class.category, data=final_condos_table, FUN=siterange

```
##
                           building.class.category borough.FUN1 borough.FUN2
## 1 04 TAX CLASS 1 CONDOS
                                                                       3.808910
                                                              853
## 2 12 CONDOS - WALKUP APARTMENTS
                                                              719
                                                                       3.061196
## 3 13 CONDOS - ELEVATOR APARTMENTS
                                                             9138
                                                                       1.850843
## 4 15 CONDOS - 2-10 UNIT RESIDENTIAL
                                                              883
                                                                       2.408834
## 5 16 CONDOS - 2-10 UNIT WITH COMMERCIAL UNIT
                                                               48
                                                                       1.645833
## 6 28 COMMERCIAL CONDOS
                                                              590
                                                                       1.427119
     borough.FUN3 sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
                4
                               853
                                           2360.098
                                                                1681
## 2
                3
                               719
                                           2034.790
                                                                1725
## 3
                1
                              9138
                                           2582.424
                                                                2324
                                                                2223
## 4
                3
                               883
                                           2440.909
## 5
                1
                                48
                                           2307.167
                                                                1425
                               590
## 6
                1
                                           3856.912
                                                                4759
     gross.sqft.FUN1 gross.sqft.FUN2 gross.sqft.FUN3
## 1
                 853
                                     0
## 2
                 719
                                     0
                                                      0
                                                      0
## 3
                9138
                                     0
## 4
                  883
                                     0
                                                      0
## 5
                  48
                                     0
                                                      0
## 6
                  590
                                     0
                                                      0
# Coops
summaryBy(borough+sale.price+gross.sqft~building.class.category, data=final_coops_table, FUN=siterange)
##
                           building.class.category borough.FUN1 borough.FUN2
## 1 09 COOPS - WALKUP APARTMENTS
                                                             2367
                                                                       2.800591
## 2 10 COOPS - ELEVATOR APARTMENTS
                                                            12514
                                                                       2.095493
     borough.FUN3 sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
                              2367
                                           1956.845
                3
                                                                1313
## 2
                1
                             12514
                                           2075.166
                                                                1550
     gross.sqft.FUN1 gross.sqft.FUN2 gross.sqft.FUN3
##
                2367
                             303.2467
                                                      0
                                                      0
## 2
               12514
                             424.0642
## Summary statistics across time
# Family homes
summaryBy(sale.price+gross.sqft~month, data=final_homes_table_time_transformation, FUN=siterange)
##
          month sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
                                         2330.566
        January
                            1498
## 2
       February
                            1452
                                         2314.731
                                                              1926
## 3
          March
                            1583
                                         2291.379
                                                              1949
## 4
                            1632
                                         2272.080
                                                              1949
          April
## 5
            May
                            1861
                                         2337.026
                                                              2057
                                         2291.684
## 6
                            1747
                                                              2005
           June
## 7
           July
                            1475
                                         2268.840
                                                              2055
## 8
                                         2279.734
                                                              2005
         August
                            1965
## 9
      September
                            1508
                                         2373.910
                                                              2025
## 10
        October
                            1444
                                         2335.124
                                                              1963
## 11
       November
                            1410
                                         2273.032
                                                              1990
## 12 December
                            2019
                                         2261.208
                                                              1967
##
      gross.sqft.FUN1 gross.sqft.FUN2 gross.sqft.FUN3
## 1
                  1498
                              2065.942
                                                 1880.5
## 2
                  1452
                              2108.914
                                                 1944.0
## 3
                              2110.350
                                                 1936.0
                  1583
```

```
2139.499
## 5
                  1861
                                                   1960.0
                               2075.653
## 6
                  1747
                                                   1920.0
## 7
                  1475
                               2103.929
                                                   1923.0
## 8
                  1965
                               2151.002
                                                   1944.0
## 9
                                                   1920.0
                  1508
                               2089.117
## 10
                               2054.288
                                                   1890.0
                  1444
## 11
                  1410
                               2119.741
                                                   1941.0
## 12
                  2019
                               2228.621
                                                   2000.0
# Condos
summaryBy(sale.price+gross.sqft~month, data=final_condos_table_time_transformation, FUN=siterange)
          month sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
                              847
                                          2626.290
                                                              2210.0
        January
## 2
       February
                              750
                                          2509.296
                                                              2103.0
## 3
                                          2688.014
          March
                              841
                                                              2323.0
## 4
          April
                             1022
                                          2545.070
                                                              2242.5
## 5
             May
                             1093
                                          2451.008
                                                              2252.0
## 6
            June
                             1220
                                          2366.601
                                                              2082.0
## 7
            July
                             1061
                                          2438.437
                                                              2223.0
## 8
                             1433
                                          2745.590
                                                              2324.0
         August
## 9
      September
                              912
                                          2674.525
                                                              2270.0
## 10
        October
                              966
                                          2668.768
                                                              2247.0
       November
                              866
                                          2661.416
                                                              2290.0
                             1220
##
  12
       December
                                          2654.170
                                                              2253.0
##
      gross.sqft.FUN1 gross.sqft.FUN2
                                         gross.sqft.FUN3
## 1
                   847
                                       0
                                                        0
## 2
                                       0
                   750
                                                        0
## 3
                   841
                                       0
                                                        0
## 4
                                       0
                                                        0
                  1022
## 5
                                       0
                                                        0
                  1093
## 6
                                       0
                  1220
                                                        0
## 7
                  1061
                                       0
                                                        0
## 8
                  1433
                                       0
                                                        0
## 9
                                       0
                   912
                                                        0
## 10
                   966
                                       0
                                                        0
## 11
                                       0
                                                        0
                   866
## 12
                  1220
                                       0
                                                        0
# Coops
summaryBy(sale.price+gross.sqft~month, data=final_coops_table_time_transformation, FUN=siterange)
##
          month sale.price.FUN1 sale.price.FUN2 sale.price.FUN3
## 1
        January
                             1044
                                          2044.966
                                                              1500.5
       February
## 2
                              954
                                          2014.828
                                                              1429.5
## 3
          March
                             1020
                                          2025.698
                                                              1444.5
## 4
                             1104
                                          2056.538
          April
                                                              1481.0
## 5
             May
                             1395
                                          2040.356
                                                              1495.0
## 6
            June
                                          2047.463
                                                              1592.0
                             1414
## 7
                             1539
                                          2081.932
                                                              1592.0
            July
## 8
         August
                             1915
                                          2006.051
                                                              1514.0
## 9
      September
                             1007
                                          1998.734
                                                              1481.0
## 10
        October
                             1076
                                          2089.680
                                                              1550.0
## 11
       November
                             1013
                                          2125.953
                                                              1559.0
```

1960.0

4

12

December

1632

2127.472

1587.5

2146.330

1400

```
##
      gross.sqft.FUN1 gross.sqft.FUN2 gross.sqft.FUN3
## 1
                  1044
                              793.74138
                                                        0
## 2
                   954
                                0.00000
                                                        0
                  1020
                             1573.27647
                                                        0
## 3
## 4
                  1104
                              434.80525
                                                        0
## 5
                  1395
                               41.97849
                                                        0
                              341.94484
                                                        0
## 6
                  1414
                              348.84990
## 7
                  1539
                                                        0
## 8
                  1915
                              407.56606
                                                        0
## 9
                  1007
                                                        0
                              484.77756
## 10
                  1076
                              480.73699
                                                        0
                                                        0
## 11
                  1013
                                0.00000
                              175.86357
## 12
                  1400
                                                        0
```

Conclusion

- As compared to other boroughs, sale prices are the highest in brooklyn
- By analysing boroughs over time, we can see that sale prices don't change much throught a year
- From summary stats, we can notice that for family homes, smaller the home, higher the price.

Problem 2

```
setwd('E:/STEVENS/study/FE-582/assignments/asst1/HW1_S20')
getwd()

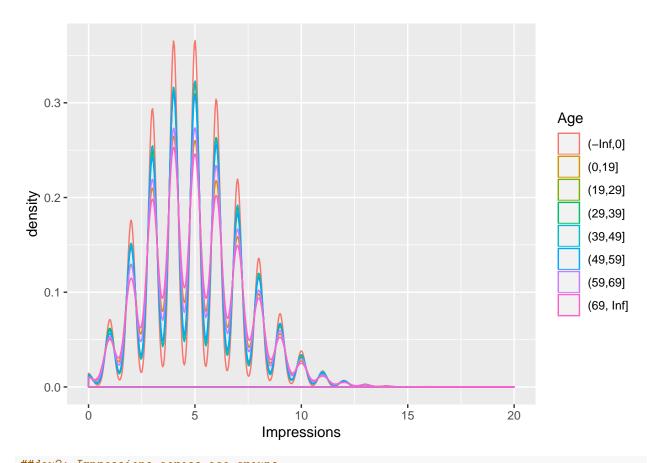
## [1] "E:/STEVENS/study/FE-582/assignments/asst1/HW1_S20"

day1 <- data.frame(read.csv("nyt1.csv"))
day2 <- data.frame(read.csv("nyt2.csv"))
day3 <- data.frame(read.csv("nyt3.csv"))

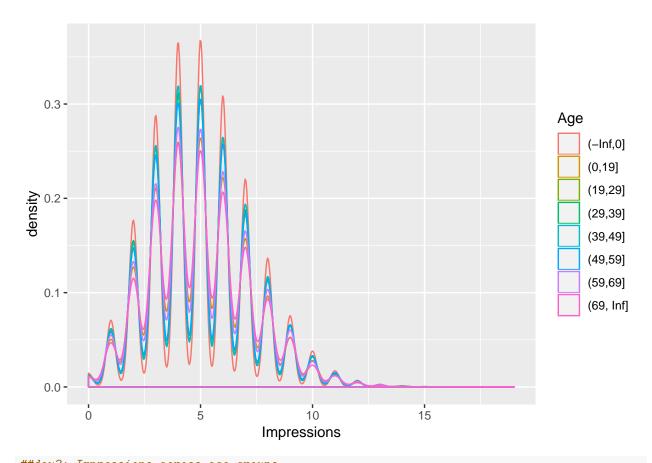
day1$age_group <- cut(day1$Age, c(-Inf,0,19,29,39,49,59,69,Inf))
day2$age_group <- cut(day2$Age, c(-Inf,0,19,29,39,49,59,69,Inf))
day3$age_group <- cut(day3$Age, c(-Inf,0,19,29,39,49,59,69,Inf))
day3$age_group <- cut(day3$Age, c(-Inf,0,19,29,39,49,59,69,Inf))

day1$ctr <- day1$Clicks / day1$Impressions
day2$ctr <- day2$Clicks / day2$Impressions
day3$ctr <- day3$Clicks / day3$Impressions
library(ggplot2)

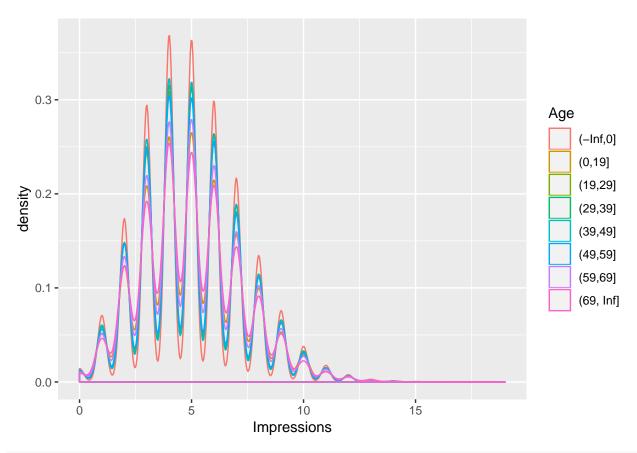
##day1: Impressions across age groups
ggplot(day1, aes(x=Impressions, color=age_group)) + geom_density() + xlab("Impressions") + labs(color='...)</pre>
```



##day2: Impressions across age groups
ggplot(day2, aes(x=Impressions, color=age_group)) + geom_density() + xlab("Impressions") + labs(color=')



##day3: Impressions across age groups
ggplot(day3, aes(x=Impressions, color=age_group)) + geom_density() + xlab("Impressions") + labs(color=')



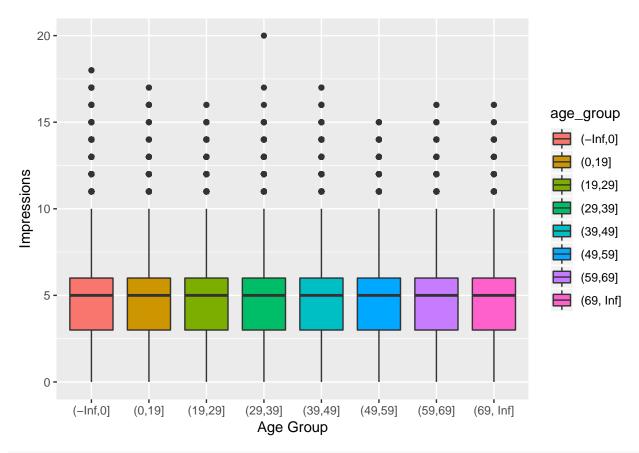
```
day1$click_group[day1$Clicks == 0] <- '0 clicks'
day1$click_group[day1$Clicks > 0] <- '> 0 clicks'

day2$click_group[day2$Clicks == 0] <- '0 clicks'
day2$click_group[day2$Clicks > 0] <- '> 0 clicks'

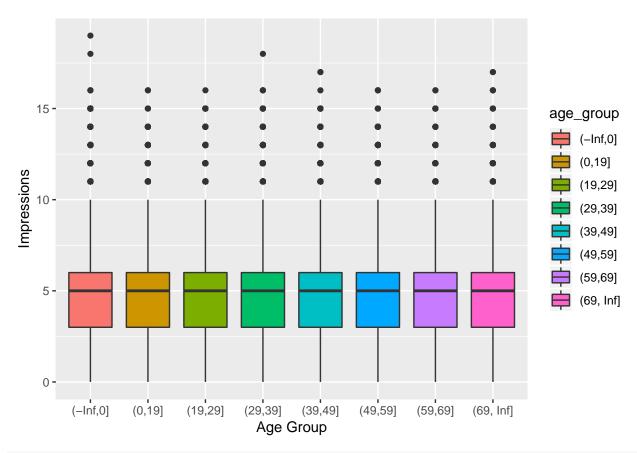
day3$click_group[day3$Clicks == 0] <- '0 clicks'
day3$click_group[day3$Clicks > 0] <- '> 0 clicks'

# comparison across age groups

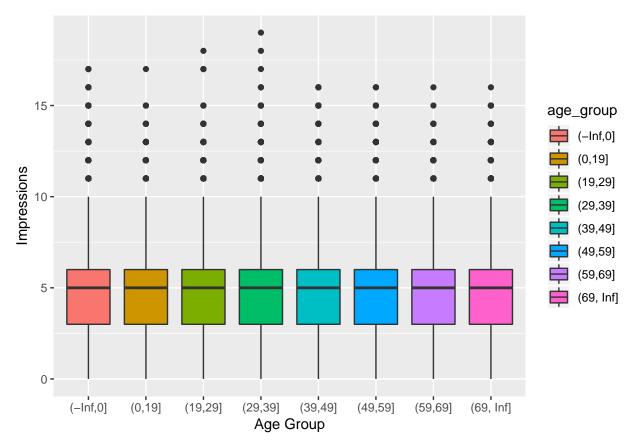
##day1
ggplot(day1, aes(x=age_group, y=Impressions, fill=age_group)) +
geom_boxplot() + xlab("Age Group")
```



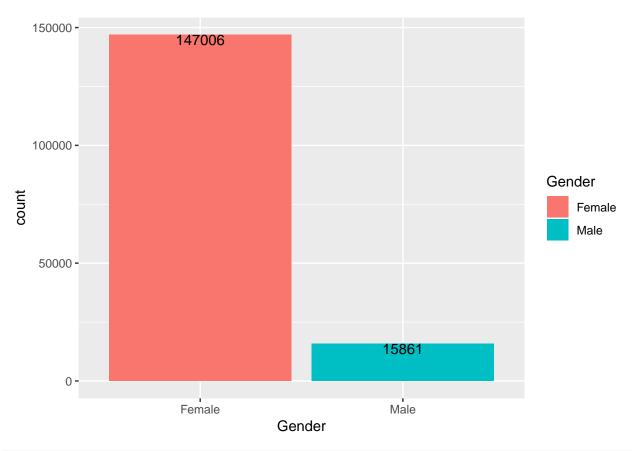
```
##day2
ggplot(day2, aes(x=age_group, y=Impressions, fill=age_group)) +
  geom_boxplot() + xlab("Age Group")
```



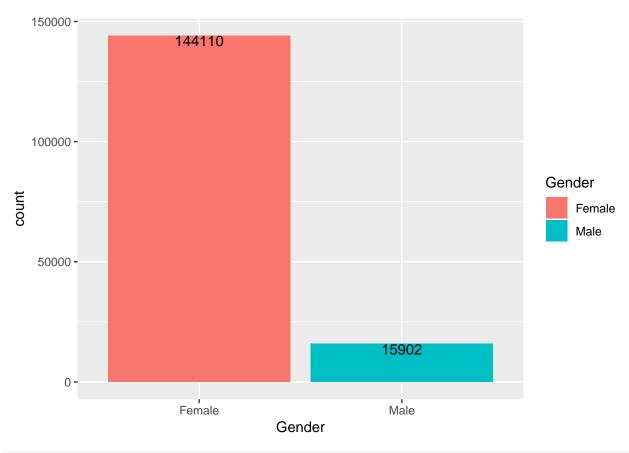
```
##day3
ggplot(day3, aes(x=age_group, y=Impressions, fill=age_group)) +
  geom_boxplot() + xlab("Age Group")
```



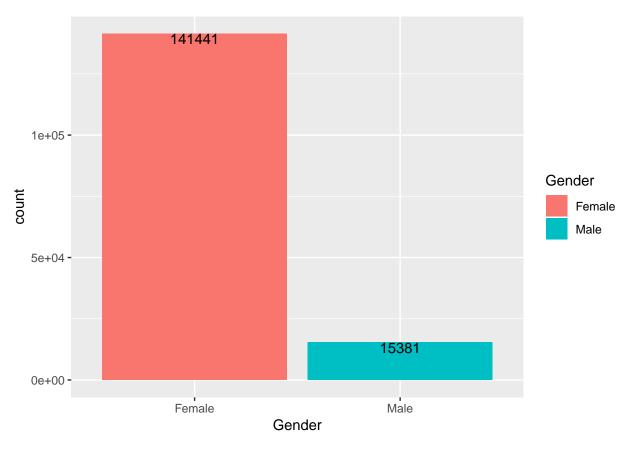
```
# data transformation
to_category <- function(df){</pre>
  df$Gender[df$Gender == 1] <- 'Male'</pre>
  df$Gender[df$Gender == 0] <- 'Female'</pre>
  df$Signed_In[df$Signed_In == 1] <- 'logged_in'</pre>
  df$Signed_In[df$Signed_In == 0] <- 'not logged_in'</pre>
  return(df)
}
day1 <- to_category(day1)</pre>
day2 <- to_category(day2)</pre>
day3 <- to_category(day3)</pre>
## comparison across user segments:
# i) <20 years old males vs <20 years old females :
day1_subset1 <- subset(day1, Age<20)</pre>
day2_subset1 <- subset(day2, Age<20)</pre>
day3_subset1 <- subset(day3, Age<20)</pre>
##day1
ggplot(day1_subset1, aes(x=Gender, y=..count..)) +
  geom_bar(aes(fill=Gender)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Gender')
```



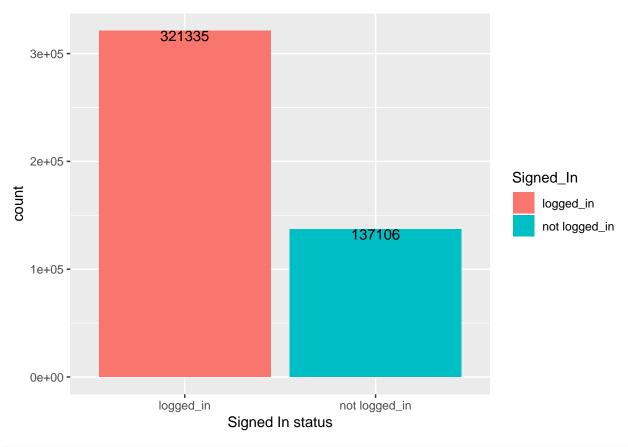
```
##day2
ggplot(day2_subset1, aes(x=Gender, y=..count..)) +
  geom_bar(aes(fill=Gender)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Gender')
```



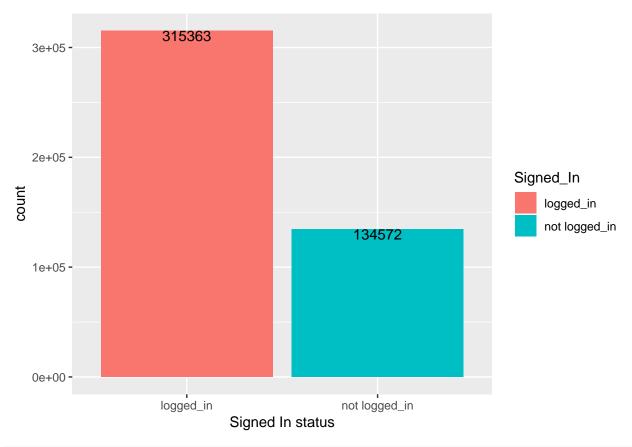
```
##day3
ggplot(day3_subset1, aes(x=Gender, y=..count..)) +
  geom_bar(aes(fill=Gender)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Gender')
```



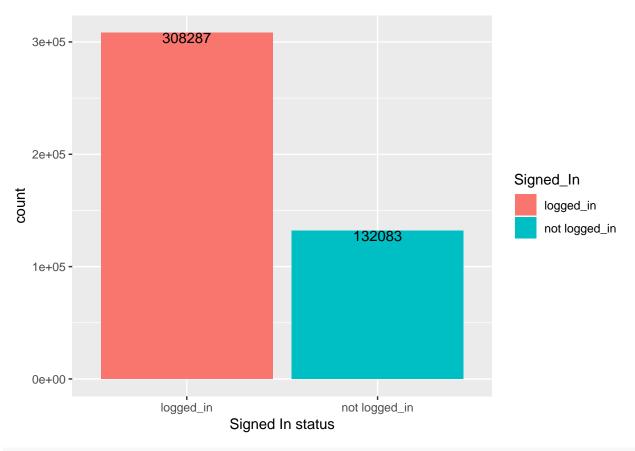
```
# ii) logged in users vs not logged in users:
##day1
ggplot(day1, aes(x=Signed_In, y=..count..)) +
  geom_bar(aes(fill=Signed_In)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Signed In status')
```



```
##day2
ggplot(day2, aes(x=Signed_In, y=..count..)) +
  geom_bar(aes(fill=Signed_In)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Signed In status')
```



```
##day3
ggplot(day3, aes(x=Signed_In, y=..count..)) +
  geom_bar(aes(fill=Signed_In)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('Signed In status')
```



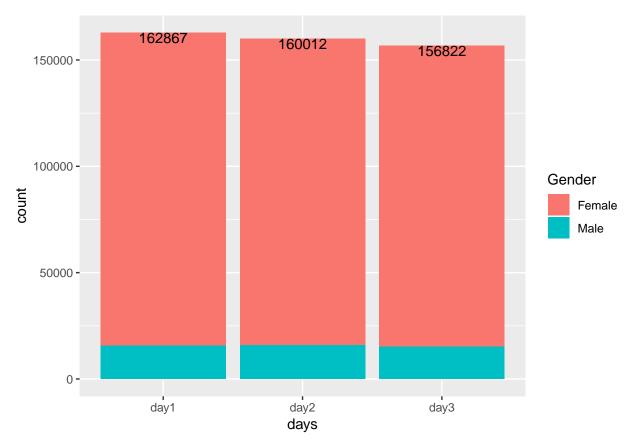
```
## Analysis across days

day1$day_id <- 'day1'
day2$day_id <- 'day2'
day3$day_id <- 'day3'
all_data <- rbind(day1, day2, day3)

# i) <20 years old males vs <20 years old females across days :

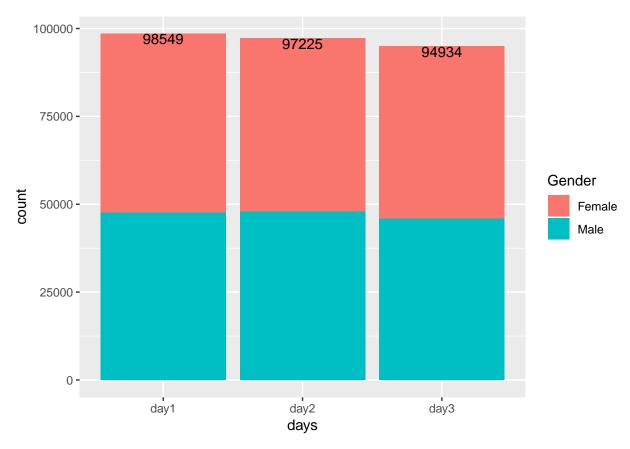
all_data_subset1 <- subset(all_data, Age<20)

ggplot(all_data_subset1, aes(x=day_id, y=..count..)) +
    geom_bar(aes(fill=Gender)) +
    geom_text(stat='count', aes(label=..count..), vjust=1)+
    xlab('days')</pre>
```



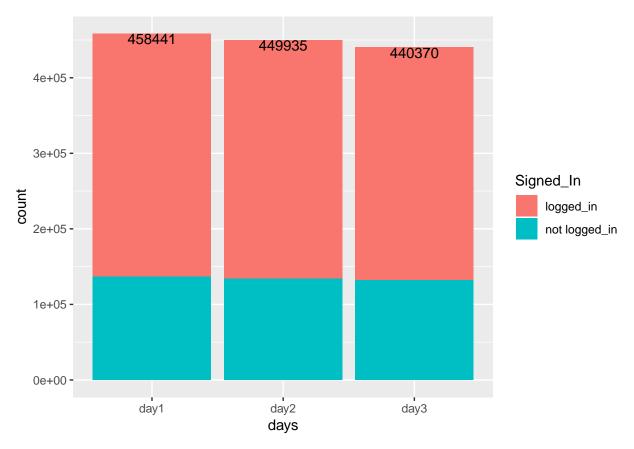
```
# ii) >50 years old males vs >50 years old females across days :
all_data_subset2 <- subset(all_data, Age>50)

ggplot(all_data_subset2, aes(x=day_id, y=..count..)) +
   geom_bar(aes(fill=Gender)) +
   geom_text(stat='count', aes(label=..count..), vjust=1)+
   xlab('days')
```



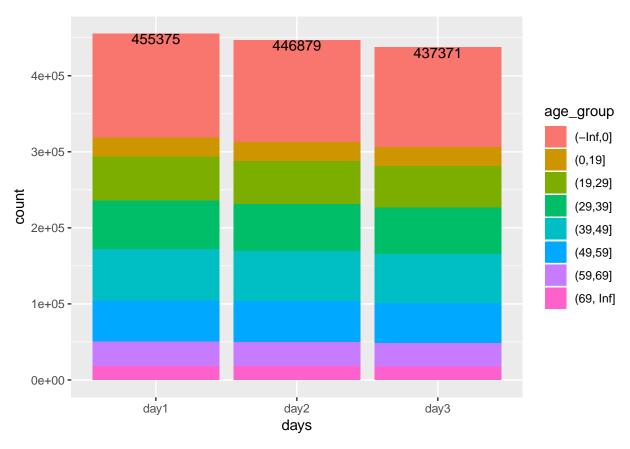
```
# iii) logged in users vs not logged in users across days:

ggplot(all_data, aes(x=day_id, y=..count..)) +
  geom_bar(aes(fill=Signed_In)) +
  geom_text(stat='count', aes(label=..count..), vjust=1)+
  xlab('days')
```



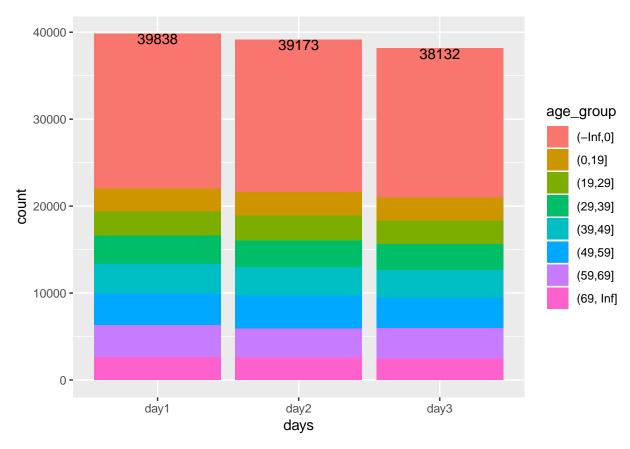
```
# iv) distribution of impressions across days and age groups

ggplot(subset(all_data, Impressions>0), aes(x=day_id, y=..count..)) +
   geom_bar(aes(fill=age_group)) +
   geom_text(stat='count', aes(label=..count..), vjust=1)+
   xlab('days')
```



```
# v) distribution of '> clicks' across days and age groups

ggplot(subset(all_data, Clicks>0), aes(x=day_id, y=..count..)) +
   geom_bar(aes(fill=age_group)) +
   geom_text(stat='count', aes(label=..count..), vjust=1)+
   xlab('days')
```



```
# vi) distribution of logged in users across days and across age groups

ggplot(subset(all_data, Signed_In=='logged_in'), aes(x=day_id, y=..count..)) +
   geom_bar(aes(fill=age_group)) +
   geom_text(stat='count', aes(label=..count..), vjust=1)+
   xlab('days')
```

