Assignment 10

Samira Zarandioon April 1, 2017

1. Fist we download the data:

```
library(downloader)
download("http://stat.columbia.edu/~rachel/datasets/nyt1.csv", destfile="nyt1.csv")
```

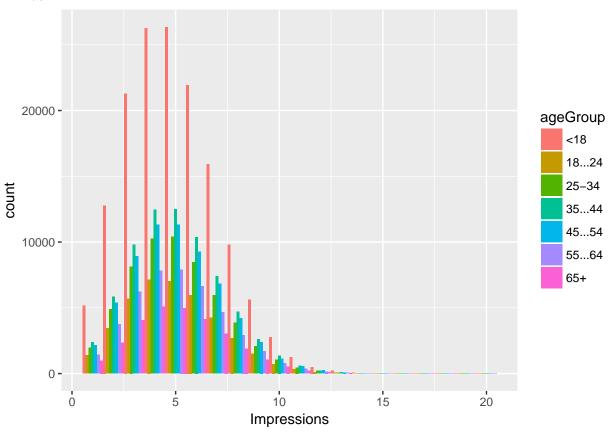
- 2. Add new variable ageGroup for the following groups: < 18, 18-24, 25-34, 35-44, 45-54, 55-64 and 65+ nyt_dataframe <- read.csv("nyt1.csv", stringsAsFactors=FALSE, header=TRUE) nyt_dataframe\$ageGroup[nyt_dataframe\$Age<18] <- "<18" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=18 & nyt_dataframe\$Age<=24] <- "18-24" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=25 & nyt_dataframe\$Age<=34] <- "25-34" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=35 & nyt_dataframe\$Age<=44] <- "35-44" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=45 & nyt_dataframe\$Age<=54] <- "45-54" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=55 & nyt_dataframe\$Age<=64] <- "55-64" nyt_dataframe\$ageGroup[nyt_dataframe\$Age>=65] <- "65+"
- 3. Create a sub data set called ImpSub that contains rows with Impressions > 0:
- r ImpSub<-nyt_dataframe[nyt_dataframe\$Impressions>0,]

```
ImpSub$CTR = ImpSub$Clicks / ImpSub$Impressions
#install.packages("qqplot2")
library(ggplot2)
ggplot(ImpSub, aes(x=Impressions, fill=ageGroup)) +
    geom_histogram(binwidth=1, position="dodge")
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x1e
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x80
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## Warning in grid.Call.graphics(L_{\text{text}}, as.graphicsAnnot(x$label), x$x, x
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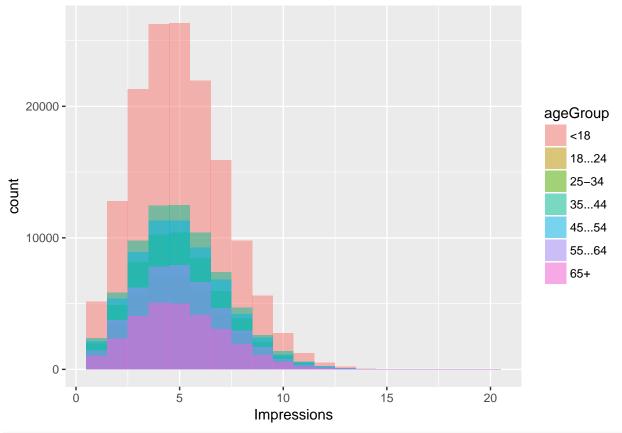


#install.packages("ggplot2")
library(ggplot2)

```
ggplot(ImpSub, aes(x=Impressions, fill=ageGroup)) +
   geom_histogram(binwidth=1, alpha=.5, position="identity")
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## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $v, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
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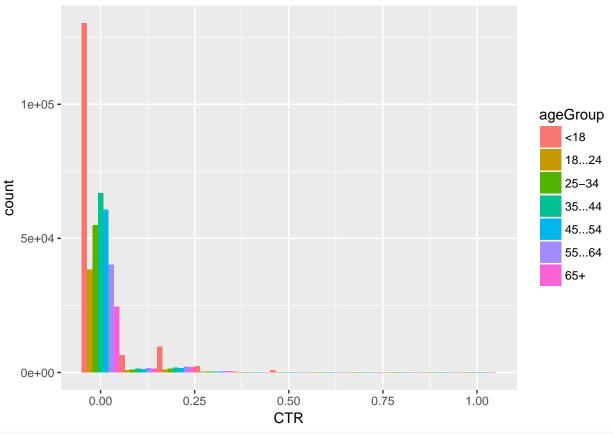
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#install.packages("ggplot2")
library(ggplot2)
ggplot(ImpSub, aes(x=CTR, fill=ageGroup)) +
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## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <e2>
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## <80>
```

```
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_{\text{text}}, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## <93>
```

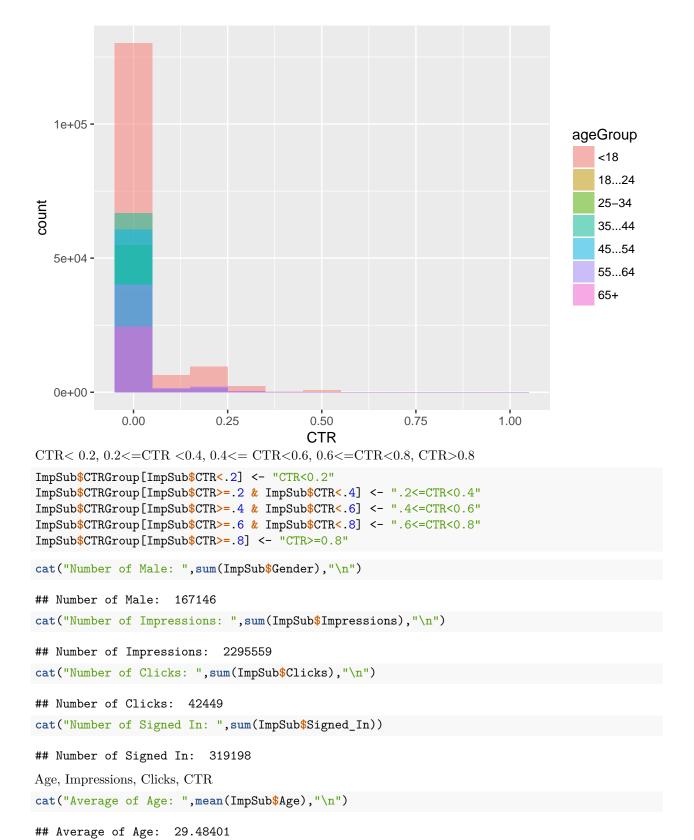


#install.packages("ggplot2")
library(ggplot2)

```
ggplot(ImpSub, aes(x=CTR, fill=ageGroup)) +
   geom_histogram(binwidth=.1, alpha=.5, position="identity")
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x1e
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x80
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '18-24' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '18-24' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '18-24' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x1e
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x80
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '35-44' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '35-44' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '35-44' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x1e
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x80
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '45-54' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '45-54' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '45-54' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x1e
## Warning in grid.Call(L stringMetric, as.graphicsAnnot(x$label)): font
## metrics unknown for character 0x80
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '55-64' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '55-64' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_stringMetric, as.graphicsAnnot(x$label)): conversion
## failure on '55-64' in 'mbcsToSbcs': dot substituted for <93>
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <e2>
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## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for <93>
```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <e2>
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <80>
## Warning in grid.Call(L textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
## conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## <e2>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## <80>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '18-24' in 'mbcsToSbcs': dot substituted for
## <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## <e2>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $v, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## <80>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '35-44' in 'mbcsToSbcs': dot substituted for
## <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## <e2>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## <80>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '45-54' in 'mbcsToSbcs': dot substituted for
## <93>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $v, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## <e2>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## <80>
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x, x
## $y, : conversion failure on '55-64' in 'mbcsToSbcs': dot substituted for
## <93>
```



Average of Impressions: 5.04103

cat("Average of Impressions: ",mean(ImpSub\$Impressions),"\n")

```
cat("Average of Clicks: ",mean(ImpSub$Clicks),"\n")
## Average of Clicks: 0.09321768
cat("Average of CTR: ",mean(ImpSub$CTR),"\n")
## Average of CTR: 0.01847053
cat("Percentage of Males: ", 100 * sum(ImpSub$Gender)/nrow(ImpSub),"\n")
## Percentage of Males: 36.70513
cat("Percentage of Signed In: ", 100 * sum(ImpSub$Signed_In)/nrow(ImpSub),"\n")
## Percentage of Signed In: 70.09564
aggregate(ImpSub[,c("Age","Impressions","Clicks","CTR")],list(ImpSub$ageGroup),mean)
##
     Group.1
                   Age Impressions
                                       Clicks
                                                      CTR.
## 1
         <18 1.397948
                          5.034534 0.14372052 0.028530995
## 2
      18-24 20.832187
                          5.038235 0.05362799 0.010733764
## 3
      25-34 29.503573
                         5.026055 0.05081227 0.010146329
## 4
      35-44 39.493195 5.054749 0.05202148 0.010286330
## 5
      45-54 49.492928
                         5.045172 0.05062260 0.009957612
## 6
      55-64 59.497459
                         5.053484 0.10246952 0.020306816
## 7
         65+ 72.988409
                         5.046925 0.15233226 0.029802702
aggregate(list(male_perc=ImpSub$Gender,signed_in_perc=ImpSub$Signed_In), by=list(age_group=ImpSub$ageGr
##
     age_group male_perc signed_in_perc
## 1
           <18 6.270471
                               9.160224
## 2
         18-24 53.395367
                             100.000000
## 3
        25-34 53.199772
                             100.000000
        35-44 53.170725
## 4
                             100.000000
## 5
        45-54 52.921920
                             100.000000
## 6
        55-64 53.596329
                             100.000000
## 7
           65+ 36.325116
                             100.000000
aggregate(list(count=ImpSub$ageGroup), by=list(age_group=ImpSub$ageGroup, ctr_group=ImpSub$CTRGroup), F
##
      age_group
                 ctr_group count
## 1
                              8724
            <18 .2<=CTR<0.4
## 2
          18-24 .2<=CTR<0.4
                               858
## 3
          25-34 .2<=CTR<0.4
                              1203
## 4
                              1489
         35-44 .2<=CTR<0.4
## 5
         45-54 .2<=CTR<0.4
                              1331
## 6
         55-64 .2<=CTR<0.4
                              1793
## 7
            65+ .2<=CTR<0.4
                              1742
## 8
            <18 .4<=CTR<0.6
                              1143
## 9
         18-24 .4<=CTR<0.6
                                99
         25-34 .4<=CTR<0.6
## 10
                               110
         35-44 .4<=CTR<0.6
## 11
                               124
## 12
         45-54 .4<=CTR<0.6
                               125
## 13
         55-64 .4<=CTR<0.6
                               201
           65+ .4<=CTR<0.6
                              195
## 14
## 15
            <18 .6<=CTR<0.8
                                83
## 16
         18-24 .6<=CTR<0.8
                                 3
         25-34 .6<=CTR<0.8
                                 7
## 17
```

```
## 18
           35-44 .6<=CTR<0.8
## 19
          55-64 .6<=CTR<0.8
                                   8
## 20
             65+ .6<=CTR<0.8
                                  11
## 21
             <18
                     CTR<0.2 139801
## 22
           18-24
                     CTR<0.2
                               39431
## 23
          25-34
                     CTR<0.2
                               56462
## 24
           35 - 44
                     CTR<0.2
                               68749
                     CTR<0.2
                               62369
## 25
           45-54
## 26
           55-64
                     CTR<0.2
                               42424
## 27
             65+
                     CTR<0.2
                               26587
## 28
             <18
                    CTR>=0.8
                                 158
## 29
           18-24
                    CTR>=0.8
                                  17
##
  30
           25-34
                    CTR >= 0.8
                                  19
## 31
           35-44
                    CTR>=0.8
                                  28
## 32
           45-54
                    CTR>=0.8
                                  20
           55-64
## 33
                    CTR>=0.8
                                  36
## 34
             65+
                    CTR>=0.8
                                  21
```

#install.packages("ggplot2") library(ggplot2) ggplot(ImpSub, aes(x=Impressions, fill=CTRGroup)) + geom_histogram(binwidth=1, position="dodge")

