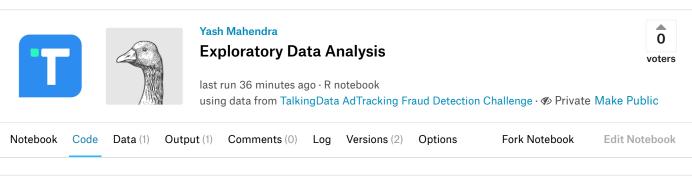


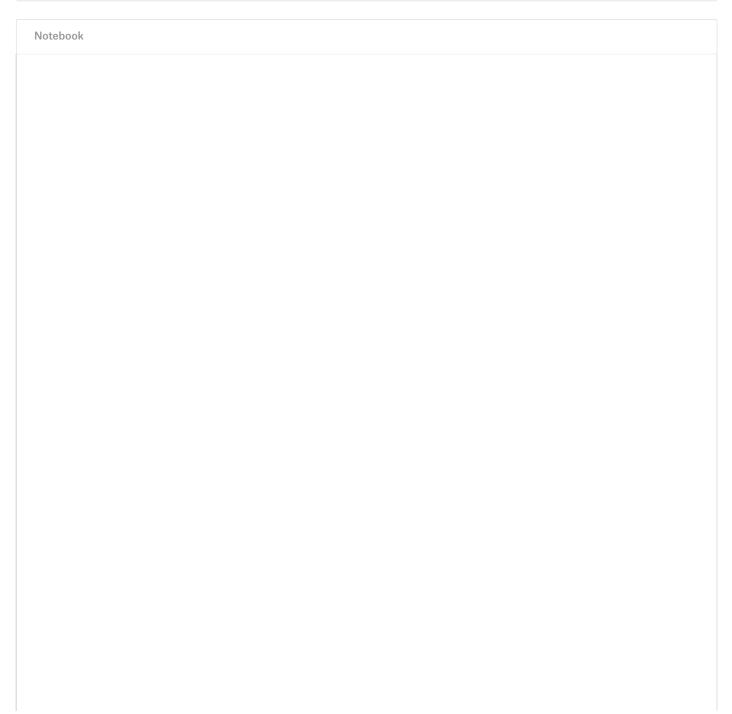
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EDA in Kaggle Kernel

```
In [1]:
    # This R environment comes with all of CRAN preinstalled, as well as many other helpful packages
    # The environment is defined by the kaggle/rstats docker image: https://github.com/kaggle/docker-rstats
    # For example, here's several helpful packages to load in

library(ggplot2) # Data visualization
library(readr) # CSV file I/O, e.g. the read_csv function

# Input data files are available in the "../input/" directory.

# For example, running this (by clicking run or pressing Shift+Enter) will list the files in the input d irectory

system("ls ../input")

# Any results you write to the current directory are saved as output.
```

```
In [2]:
        library(data.table)
        library(ggplot2)
        library(DT)
        library(magrittr)
        library(corrplot)
        library(Rmisc)
        library(ggalluvial)
        library(caret)
        library(ModelMetrics)
        require(scales)
        library(irlba)
        library(forcats)
        library(forecast)
        library(TSA)
        library(zoo)
        library(skimr)
        library(fasttime)
        library(gridExtra)
        library(Amelia)
```

```
corrplot 0.84 loaded
Loading required package: lattice
Loading required package: plyr

Attaching package: 'ModelMetrics'

The following objects are masked from 'package:caret':
        confusionMatrix, precision, recall, sensitivity, specificity

Loading required package: scales

Attaching package: 'scales'

The following object is masked from 'package:readr':
```

```
col_factor
Loading required package: Matrix
Attaching package: 'forecast'
The following object is masked from 'package:ggplot2':
    autolayer
Loading required package: leaps
Loading required package: locfit
locfit 1.5-9.1 2013-03-22
Loading required package: mgcv
Loading required package: nlme
Attaching package: 'nlme'
The following object is masked from 'package:forecast':
    getResponse
This is mgcv 1.8-23. For overview type 'help("mgcv-package")'.
Loading required package: tseries
Attaching package: 'TSA'
The following object is masked from 'package:readr':
    spec
The following objects are masked from 'package:stats':
    acf, arima
The following object is masked from 'package:utils':
   tar
Attaching package: 'zoo'
The following objects are masked from 'package:base':
   as.Date, as.Date.numeric
Loading required package: Rcpp
## Amelia II: Multiple Imputation
## (Version 1.7.4, built: 2015-12-05)
## Copyright (C) 2005-2018 James Honaker, Gary King and Matthew Blackwell
## Refer to http://gking.harvard.edu/amelia/ for more information
##
# Lets use train data and we will later split it into training and testing
```

In [3]:

Since the data is quite large, this approach can be implemented on larger data with server and cloud train <- fread("../input/train_sample.csv", showProgress=F)

In [4]:

#Check the head of Train
head(train,5)

ip	арр	device	os	channel	click_time	attributed_time	is_attributed
29540	3	1	42	489	2017-11-08 03:57:46		0
26777	11	1	25	319	2017-11-09 11:02:14		0
140926	12	1	13	140	2017-11-07 04:36:14		0
69375	2	1	19	377	2017-11-09 13:17:20		0
119166	9	2	15	445	2017-11-07 12:11:37		0

In [5]:
#Check data for Null Values
sapply(train, function(y) sum(is.na(y)))

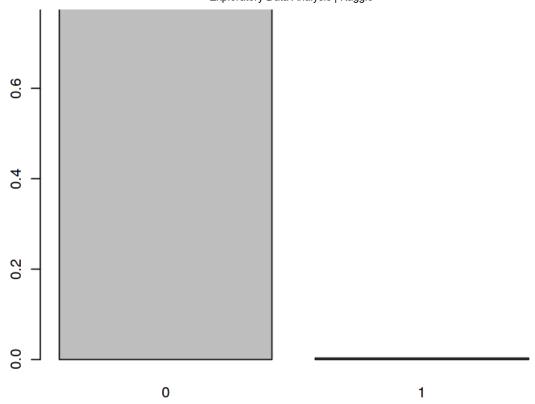
ip 0
app 0
device 0
os 0
channel 0
click_time 0
attributed_time 0
is_attributed 0

Check Factor Variable

In [6]:
 table(train\$is_attributed)

0 1 99749 251

In [7]:
 barplot(prop.table(table(train\$is_attributed)))



```
In [8]:
        str(train)
        Classes 'data.table' and 'data.frame': 100000 obs. of 8 variables:
         $ ip
                         : int 29540 26777 140926 69375 119166 126411 118315 34631 108040 14230 ...
                         : int 3 11 12 2 9 13 1 12 12 3 ...
         $ app
         $ device
                         : int 111121111 ...
         $ os
                         : int 42 25 13 19 15 17 13 6 19 13 ...
                         : int 489 319 140 377 445 477 153 140 265 19 ...
         $ channel
         $ click_time
                         : chr "2017-11-08 03:57:46" "2017-11-09 11:02:14" "2017-11-07 04:36:14" "2017-11-09 1
        3:17:20" ...
         $ attributed_time: chr "" "" "" ...
         $ is attributed : int 0000000000...
         - attr(*, ".internal.selfref")=<externalptr>
In [9]:
        summary(train)
              ip
                              app
                                             device
                                                                os
                                         Min. :
         Min.
                         Min. : 0.00
                                                    0.00
                                                          Min. : 0.00
         1st Qu.: 40316
                         1st Qu.: 3.00
                                         1st Qu.:
                                                    1.00
                                                          1st Qu.: 13.00
         Median : 79666
                         Median : 12.00
                                         Median :
                                                          Median : 18.00
                                                    1.00
         Mean : 91092
                         Mean
                               : 12.03
                                         Mean :
                                                   22.39
                                                          Mean : 22.84
         3rd Qu.:118284
                         3rd Qu.: 15.00
                                                          3rd Qu.: 19.00
                                         3rd Qu.:
                                                    1.00
              :364759
                         Max.
                               :542.00
                                         Max.
                                               :3866.00
                                                          Max.
                                                                 :866.00
            channel
                         click_time
                                          attributed_time
                                                            is_attributed
         Min. : 3.0
                        Length:100000
                                          Length:100000
                                                            Min. :0.00000
         1st Qu.:140.0
                        Class :character
                                         Class :character 1st Qu.:0.00000
```

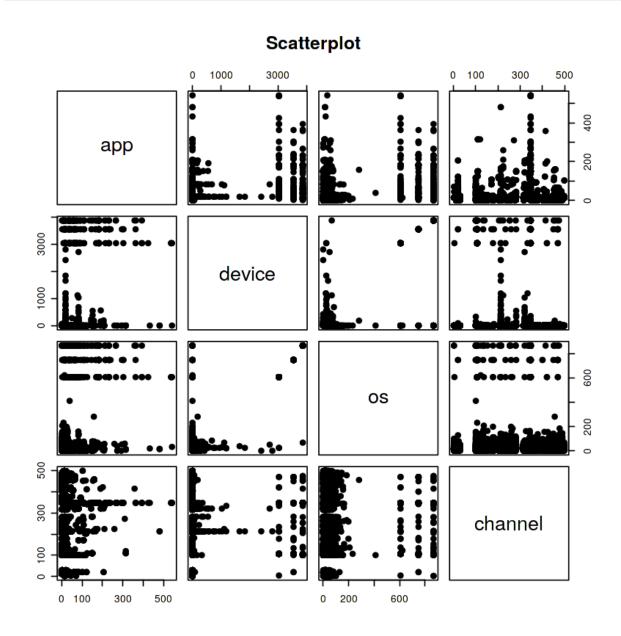
```
      Median :258.0
      Mode :character
      Mode :character
      Median :0.00000

      Mean :268.7
      Mean :0.00251

      3rd Qu::379.0
      3rd Qu::0.00000

      Max. :100000
      Max. :1.00000
```

```
In [10]:
    plot(train[,2:5], main="Scatterplot", pch=19)
```



Let's have a look at features counts:

```
In [11]:
    fea <- c("os", "channel", "device", "app", "attributed_time", "click_time", "ip")
    train[, lapply(.SD, uniqueN), .SDcols = fea] %>%
        melt(variable.name = "features", value.name = "unique_values") %>%
        ggplot(aes(reorder(features, -unique_values), unique_values)) +
        geom_bar(stat = "identity", fill = "steelblue") +
        scale_y_log10(breaks = c(50,100,250, 500, 10000, 50000)) +
```

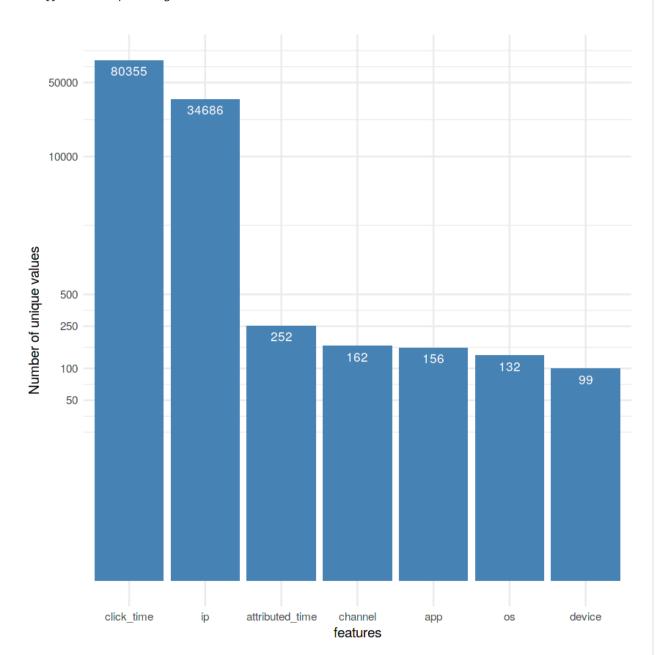
```
geom_text(aes(label = unique_values), vjust = 1.6, color = "white", size=3.5) +
theme_minimal() +
labs(x = "features", y = "Number of unique values")
```

Warning message in melt.data.table(., variable.name = "features", value.name = "unique_values"):

"To be consistent with reshape2's melt, id.vars and measure.vars are internally guessed when both are 'N

ULL'. All non-numeric/integer/logical type columns are conisdered id.vars, which in this case are column

s []. Consider providing at least one of 'id' or 'measure' vars in future."



Checking Important Features

```
labs(fill = "is_attributed")

p2=ggplot(train,aes(x=app,fill=is_attributed))+
  geom_density()+facet_grid(is_attributed~.)+
  scale_x_continuous(breaks = c(0,50,100,200,300,400))+
  ggtitle("Application ID v/s Is_attributed")+
  xlab("App ID") +
  labs(fill = "is_attributed")

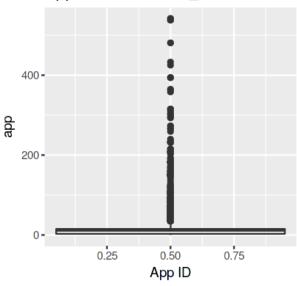
p3=ggplot(train,aes(x=is_attributed,y=app,fill=is_attributed))+
  geom_violin()+
  ggtitle("Application ID v/s Is_attributed")+
  xlab("App ID") +
  labs(fill = "is_attributed")

grid.arrange(p1,p2,p3, nrow=2,ncol=2)
```

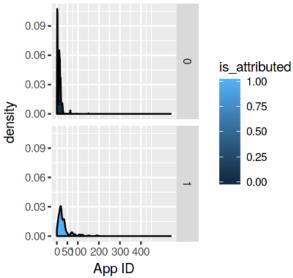
Warning message:

"Continuous x aesthetic -- did you forget aes(group=...)?"

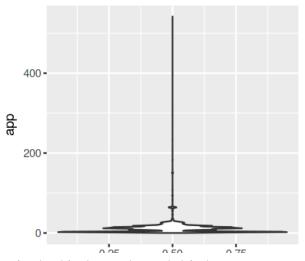
Application ID v/s ls_attributed



Application ID v/s ls_attributed



Application ID v/s Is attributed



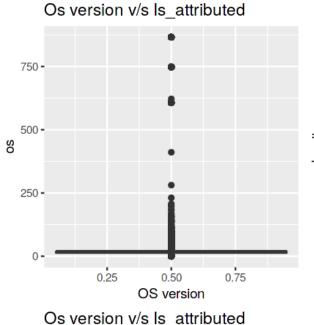
U.20 U.3U

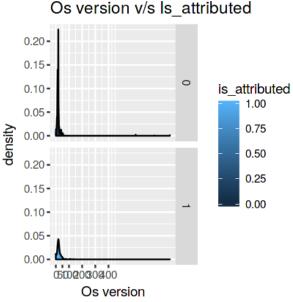
App ID

```
In [13]:
         #App downloaded vs OS version id of user mobile phone
         p4=ggplot(train,aes(x=is_attributed,y=os,fill=is_attributed))+
           geom_boxplot()+
           ggtitle("Os version v/s Is_attributed")+
           xlab("OS version") +
           labs(fill = "is_attributed")
         p5=ggplot(train,aes(x=os,fill=is_attributed))+
           geom_density()+facet_grid(is_attributed~.)+
           scale_x_continuous(breaks = c(0,50,100,200,300,400))+
           ggtitle("Os version v/s Is_attributed ")+
           xlab("Os version") +
           labs(fill = "is_attributed")
         p6=ggplot(train,aes(x=is_attributed,y=os,fill=is_attributed))+
           geom_violin()+
           ggtitle("Os version v/s Is_attributed")+
           xlab("Os version") +
           labs(fill = "is_attributed")
         grid.arrange(p4,p5, p6, nrow=2,ncol=2)
```

Warning message:

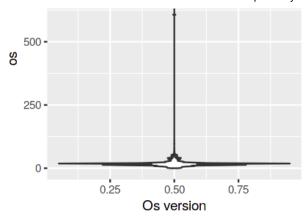
"Continuous x aesthetic -- did you forget aes(group=...)?"





https://www.kaggle.com/ymahendr/exploratory-data-analysis/code

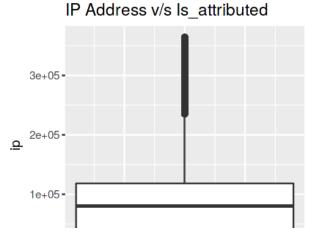
750 -



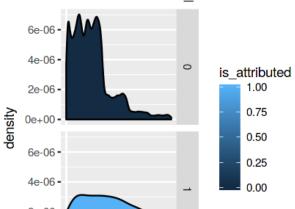
```
In [14]:
         ###App was downloaded v/s ip address of click.
         p7=ggplot(train,aes(x=is_attributed,y=ip,fill=is_attributed))+
           geom_boxplot()+
           ggtitle("IP Address v/s Is_attributed")+
           xlab("Ip Adresss of click") +
           labs(fill = "is_attributed")
         p8=ggplot(train,aes(x=ip,fill=is_attributed))+
           geom_density()+facet_grid(is_attributed~.)+
           scale_x_continuous(breaks = c(0,50,100,200,300,400))+
           ggtitle("IP Address v/s Is_attributed")+
           xlab("Ip Adresss of click") +
           labs(fill = "is_attributed")
         p9=ggplot(train,aes(x=is_attributed,y=ip,fill=is_attributed))+
           geom_violin()+
           ggtitle("IP Address v/s Is_attributed")+
           xlab("Ip Adresss of click") +
           labs(fill = "is_attributed")
         grid.arrange(p7,p8, p9, nrow=2,ncol=2)
```

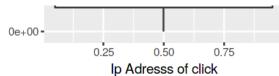
Warning message:

"Continuous x aesthetic -- did you forget aes(group=...)?"



IP Address v/s Is attributed

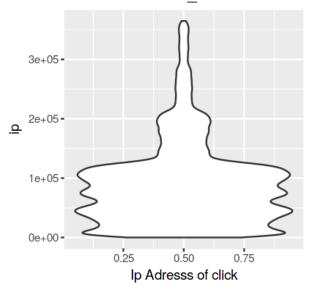






Ip Adresss of click

IP Address v/s Is_attributed



```
In [15]:
         ###App was downloaded v/s device type id of user mobile phone
         p10=ggplot(train,aes(x=device,fill=is_attributed))+
           geom_density()+facet_grid(is_attributed~.)+
           ggtitle("Device type v/s Is_attributed")+
           xlab("Device Type ID") +
           labs(fill = "is_attributed")
         p11=ggplot(train,aes(x=is_attributed,y=device,fill=is_attributed))+
           geom_boxplot()+
           ggtitle("Device type v/s Is_attributed")+
           xlab("Device Type ID") +
           labs(fill = "is_attributed")
         p12=ggplot(train,aes(x=is_attributed,y=device,fill=is_attributed))+
           geom_violin()+
           ggtitle("Device type v/s Is_attributed")+
           xlab("Device Type ID") +
           labs(fill = "is_attributed")
         grid.arrange(p10,p11, p12, nrow=2,ncol=2)
```

"Continuous x aesthetic -- did you forget aes(group=...)?"

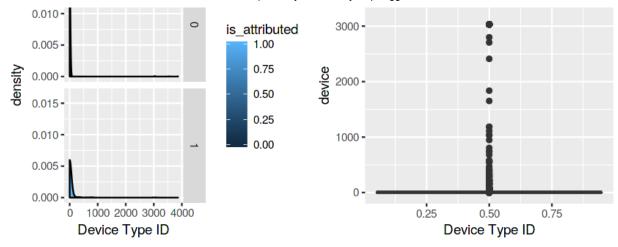
Device type v/s Is_attributed

0.015

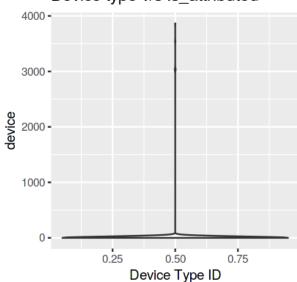
Device type v/s ls_attributed



Warning message:

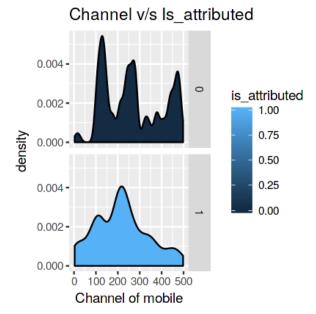


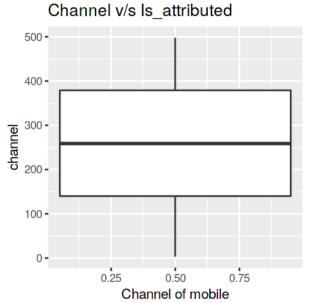
Device type v/s Is_attributed

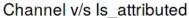


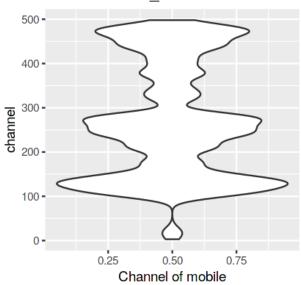
```
In [16]:
         ###App was downloaded v/s channel id of mobile ad publisher
         p13=ggplot(train,aes(x=channel,fill=is_attributed))+
           geom_density()+facet_grid(is_attributed~.)+
           ggtitle("Channel v/s Is_attributed")+
           xlab("Channel of mobile") +
           labs(fill = "is_attributed")
         p14=ggplot(train,aes(x=is_attributed,y=channel,fill=is_attributed))+
           geom_boxplot()+
           ggtitle("Channel v/s Is_attributed")+
           xlab("Channel of mobile") +
           labs(fill = "is_attributed")
         p15=ggplot(train,aes(x=is_attributed,y=channel,fill=is_attributed))+
           geom_violin()+
           ggtitle("Channel v/s Is_attributed")+
           xlab("Channel of mobile") +
           labs(fill = "is_attributed")
         grid.arrange(p13,p14, p15, nrow=2,ncol=2)
```

Warning message:
"Continuous x aesthetic -- did you forget aes(group=...)?"



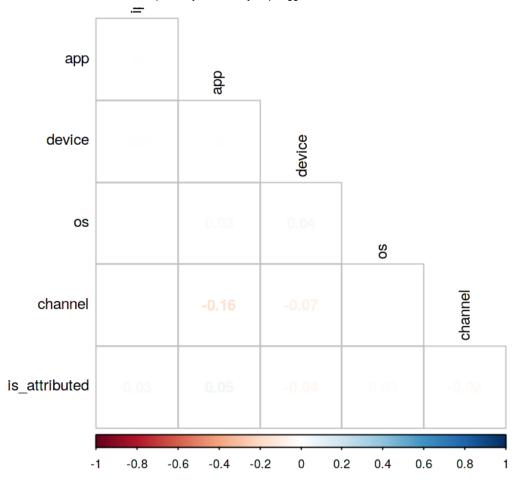






Correlation

```
In [17]:
    train[, -c("click_time", "attributed_time"), with=F] %>%
    cor(method = "spearman") %>%
    corrplot(type="lower", method = "number", tl.col = "black", diag=FALSE)
```



End

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