Analysis for ad target audience

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R Week 1 IP

Defining the question

A Kenyan entrepreneur has created an online cryptography course and would want to advertise it on her blog. She currently targets audiences originating from various countries. In the past, she ran ads to advertise a related course on the same blog and collected data in the process. She would now like to employ your services as a Data Science Consultant to help her identify which individuals are most likely to click on her ads.

Loading the dataset

```
Dataset: http://bit.ly/IPAdvertisingData
# Let us import the library 'Data Table'
library("data.table")
ad data <- fread('http://bit.ly/IPAdvertisingData')</pre>
# preview the first 6 values
head(ad data)
      Daily Time Spent on Site Age Area Income Daily Internet Usage
##
## 1:
                          68.95
                                 35
                                       61833.90
                                                               256.09
## 2:
                          80.23 31
                                       68441.85
                                                               193.77
## 3:
                          69.47 26
                                       59785.94
                                                               236.50
## 4:
                          74.15
                                 29
                                       54806.18
                                                               245.89
## 5:
                          68.37
                                 35
                                       73889.99
                                                               225.58
## 6:
                          59.99 23
                                       59761.56
                                                               226.74
##
                               Ad Topic Line
                                                        City Male
                                                                      Country
## 1:
         Cloned 5thgeneration orchestration
                                                 Wrightburgh
                                                                      Tunisia
## 2:
         Monitored national standardization
                                                   West Jodi
                                                                1
                                                                        Nauru
           Organic bottom-line service-desk
                                                    Davidton
                                                                0 San Marino
## 3:
## 4: Triple-buffered reciprocal time-frame West Terrifurt
                                                                1
                                                                        Italy
              Robust logistical utilization
## 5:
                                                South Manuel
                                                                0
                                                                      Iceland
## 6:
            Sharable client-driven software
                                                                1
                                                   Jamieberg
                                                                       Norway
                Timestamp Clicked on Ad
##
## 1: 2016-03-27 00:53:11
                                       0
                                       0
## 2: 2016-04-04 01:39:02
## 3: 2016-03-13 20:35:42
                                       0
## 4: 2016-01-10 02:31:19
```

Cleaning the dataset

Removing missing values

```
# using the function 'colSums', we can identify the total number of missing
values in each column
colSums(is.na(ad data))
## Daily Time Spent on Site
                                                   Age
                                                                     Area Income
##
                                                     0
                                                                                0
##
       Daily Internet Usage
                                        Ad Topic Line
                                                                            City
##
                                                                                0
##
                        Male
                                               Country
                                                                       Timestamp
##
                           0
                                                     0
                                                                                0
##
              Clicked on Ad
##
```

We can see that no columns in our dataset contain missing values.

Removing duplicates

```
# To get rid of duplicates, we will identify the unique values from our
dataset and assign them to variable 'unique ad'
unique_ad <- unique(ad_data)</pre>
# print the variable and check out the unique values
unique ad
##
         Daily Time Spent on Site Age Area Income Daily Internet Usage
##
      1:
                             68.95
                                     35
                                           61833.90
                                                                   256.09
##
      2:
                             80.23
                                    31
                                           68441.85
                                                                   193.77
##
      3:
                             69.47
                                    26
                                           59785.94
                                                                    236.50
##
      4:
                             74.15
                                    29
                                           54806.18
                                                                   245.89
                             68.37
##
      5:
                                    35
                                           73889.99
                                                                   225.58
##
    996:
                             72.97
                                    30
                                                                    208.58
##
                                           71384.57
    997:
                             51.30
##
                                    45
                                           67782.17
                                                                   134.42
##
    998:
                             51.63
                                     51
                                           42415.72
                                                                   120.37
    999:
                                     19
##
                             55.55
                                           41920.79
                                                                   187.95
## 1000:
                             45.01
                                    26
                                           29875.80
                                                                   178.35
##
                                   Ad Topic Line
                                                            City Male
##
      1:
            Cloned 5thgeneration orchestration
                                                     Wrightburgh
      2:
            Monitored national standardization
##
                                                       West Jodi
                                                                    1
##
               Organic bottom-line service-desk
                                                        Davidton
                                                                    0
##
      4: Triple-buffered reciprocal time-frame West Terrifurt
                                                                    1
##
      5:
                  Robust logistical utilization
                                                   South Manuel
                                                                    0
##
##
    996:
                  Fundamental modular algorithm
                                                       Duffystad
                                                                    1
```

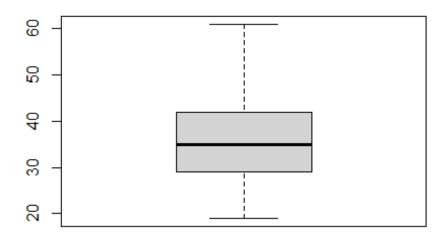
```
997:
               Grass-roots cohesive monitoring
                                                   New Darlene
                  Expanded intangible solution South Jessica
##
    998:
                                                                  1
         Proactive bandwidth-monitored policy
                                                                  0
## 999:
                                                   West Steven
               Virtual 5thgeneration emulation
                                                   Ronniemouth
                                                                  0
## 1000:
##
                        Country
                                           Timestamp Clicked on Ad
##
                        Tunisia 2016-03-27 00:53:11
      1:
##
      2:
                          Nauru 2016-04-04 01:39:02
                                                                 0
##
      3:
                     San Marino 2016-03-13 20:35:42
                                                                 0
##
      4:
                          Italy 2016-01-10 02:31:19
                                                                 0
##
      5:
                        Iceland 2016-06-03 03:36:18
                                                                  0
##
   996:
                        Lebanon 2016-02-11 21:49:00
                                                                  1
##
    997: Bosnia and Herzegovina 2016-04-22 02:07:01
##
                                                                  1
   998:
                       Mongolia 2016-02-01 17:24:57
                                                                  1
## 999:
                      Guatemala 2016-03-24 02:35:54
                                                                 0
                         Brazil 2016-06-03 21:43:21
                                                                  1
## 1000:
# let us confirm whether all the duplicates have been removed
duplicated_ad <- ad_data[duplicated(ad_data),]</pre>
duplicated_ad
## Empty data.table (0 rows and 10 cols): Daily Time Spent on Site, Age, Area
Income,Daily Internet Usage,Ad Topic Line,City...
```

It seems that the dataset has no duplicated values. We originally had 1000 rows and even after getting the unique values, the number of rows remained the same. After printing out variable 'duplicated_ad', we had no output; confirming that indeed our dataset has no duplicated values.

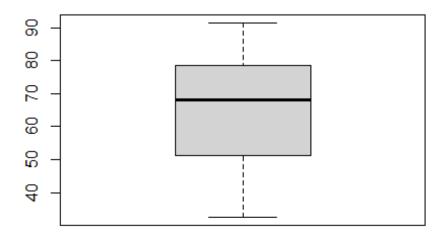
Checking for outliers

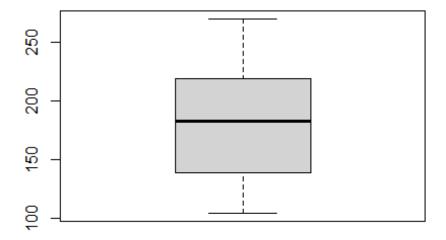
An outlier is an observation that is numerically distant from the rest of the data. When reviewing a boxplot, an outlier is defined as a data point that is located outside the fences ("whiskers") of the boxplot.

```
# using boxplots, we will check for outliers in various columns
# column 'Age'
boxplot(ad_data$Age) # No outliers!
```

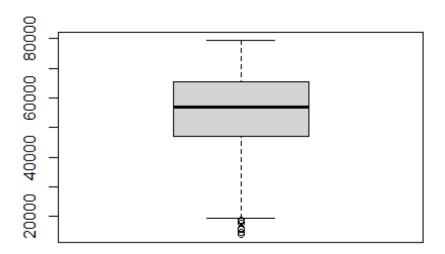


#
boxplot(ad_data\$`Daily Time Spent on Site`) # No outliers!





#
boxplot(ad_data\$`Area Income`)



Since the outliers are not too far from our minimum value, we will keep them to avoid removing important data points

Univariate analysis

Measures and Central Tendency

```
# to get the descriptive statistics of all the numerical variables, we will
use the function 'summary'
summary(ad_data)
## Daily Time Spent on Site
                                  Age
                                               Area Income
                                                               Daily Internet
Usage
                             Min.
                                     :19.00
                                              Min.
                                                     :13996
                                                              Min.
## Min.
           :32.60
                                                                      :104.8
##
   1st Qu.:51.36
                             1st Qu.:29.00
                                              1st Qu.:47032
                                                               1st Qu.:138.8
## Median :68.22
                             Median :35.00
                                              Median :57012
                                                              Median :183.1
## Mean
           :65.00
                             Mean
                                     :36.01
                                              Mean
                                                     :55000
                                                              Mean
                                                                      :180.0
##
   3rd Qu.:78.55
                             3rd Qu.:42.00
                                              3rd Qu.:65471
                                                               3rd Qu.:218.8
           :91.43
##
   Max.
                             Max.
                                     :61.00
                                              Max.
                                                     :79485
                                                              Max.
                                                                      :270.0
   Ad Topic Line
                                                Male
                                                              Country
##
                           City
    Length:1000
                       Length:1000
                                           Min.
                                                  :0.000
                                                           Length: 1000
##
    Class :character
##
                       Class :character
                                           1st Qu.:0.000
                                                           Class :character
##
   Mode :character
                       Mode :character
                                           Median :0.000
                                                           Mode :character
##
                                                  :0.481
                                           Mean
##
                                           3rd Qu.:1.000
##
                                           Max.
                                                  :1.000
##
                                   Clicked on Ad
      Timestamp
##
         :2016-01-01 02:52:10
                                  Min.
                                          :0.0
```

```
## 1st Ou.:2016-02-18 02:55:42
                                   1st Ou.:0.0
## Median :2016-04-07 17:27:29
                                  Median :0.5
           :2016-04-10 10:34:06
## Mean
                                  Mean
                                         :0.5
## 3rd Qu.:2016-05-31 03:18:14
                                   3rd Qu.:1.0
          :2016-07-24 00:22:16
## Max.
                                  Max.
                                          :1.0
# since mode doesn't have an inbuilt function, we will create a variable
'mode'
mode <- function(v) {</pre>
   uniqv <- unique(v)</pre>
   uniqv[which.max(tabulate(match(v, uniqv)))]
}
# let us get the mode in column 'Age'
age.mode <- mode(ad_data$Age)</pre>
#print out mode
age.mode
## [1] 31
```

Measures of Dispersion

```
# we already got the quantiles, minimum and maximum values
# for the rest of the measures, we will focus on column 'daily time spent on
site'
# range
site time.range <- range(ad data$`Daily Time Spent on Site`)</pre>
site_time.range
## [1] 32.60 91.43
# variance
# The variance is a numerical measure of how the data values is dispersed
around the mean.
site time.var <- var(ad data$`Daily Time Spent on Site`)</pre>
site_time.var
## [1] 251.3371
# standard deviation
site time.sd <- sd(ad data$`Daily Time Spent on Site`)</pre>
site_time.sd
## [1] 15.85361
```

Univariate visualizations

Frequency distribution using a barplot

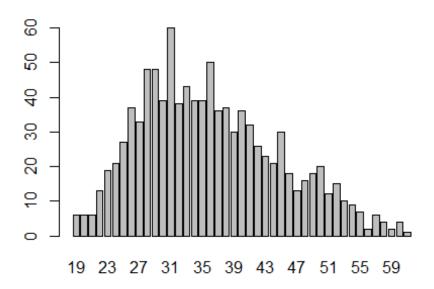
```
# fetching the 'Age' column
age <- ad_data$ Age`

# computing the frequency distribution using the table() function
age.fr <- table(age)
age.fr

## age
## 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40 41 42 43
44

## 6 6 6 13 19 21 27 37 33 48 48 39 60 38 43 39 39 50 36 37 30 36 32 26 23
21
## 45 46 47 48 49 50 51 52 53 54 55 56 57 58 59 60 61
## 30 18 13 16 18 20 12 15 10 9 7 2 6 4 2 4 1

# using a barplot to visualize this
barplot(age.fr)</pre>
```



From ages 28-37(the more frequent ages), age 31 is the most frequent # Age 61 is the least frequent

Bivariate analysis

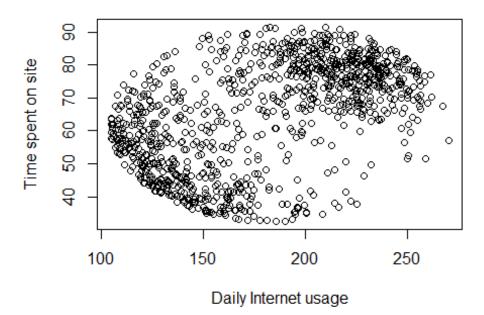
Correlation Coefficient

```
correlation coefficient is close to 1, it would indicate that the variables
are positively linearly related. For -1, it indicates that the variables are
negatively linearly related and the scatter plot almost falls along a
straight line with negative slope. And for zero, it would indicate a weak
linear relationship between the variables.
# get the columns
daily usage <- ad data$`Daily Internet Usage`</pre>
clicked <- ad data$`Clicked on Ad`</pre>
site_time <- ad_data$`Daily Time Spent on Site`</pre>
# get the correlation coefficients between the variables using cor()
cor(daily_usage , site_time)
## [1] 0.5186585
# 0.5; indicates a positive correlation although it is a bit weak.
# However, we can see that people who have a higher daily internet usage
spend more time on the site
cor(clicked, daily usage)
## [1] -0.7865392
# -0.78; a negative correlation which is relatively strong.
# We see that people who spend more time on the site and on the Internet tend
to click less on the ads.
```

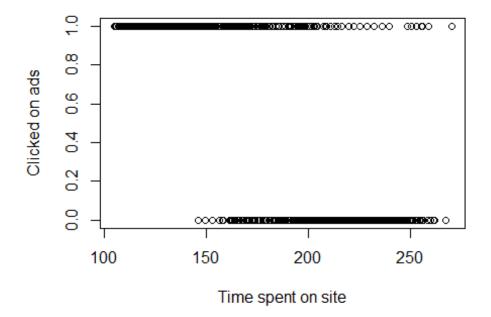
It is a normalized measurement of how the two are linearly related. If the

Visualizations

```
# scatterplots
plot(daily_usage, site_time, xlab="Daily Internet usage", ylab="Time spent on site")
```



The points are quite scattered but if you look closely, you see the points
show a weak positive linear relationship
between the two variables
plot(daily_usage, clicked, xlab="Time spent on site", ylab="Clicked on ads")



With how the points are distributed, we realize a rather stronge negative correlation between the variables

From our bivariate analysis, we see that the users who have higher daily internet usage tend to spend more time on the site. Also, we realised that those users who spend more time on the site, actually tend to click on the ads less. This might be because the ads are not in their interest hence they tend to ignore them. A very brief survey should be taken by the user before using the site so as to tailor the ads to the user's interests which might make them click on them more frequently.