Moringa_Data_Science_Prep_W12_Independent_Project_202 0_02_Gideon_Cheruiyot_DataReport

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#Problem statement: I dentify individuals who are more likely to click on the Ads posted on his/her blog

#Metrics of success: our success will be measured by our ability to identify attributes of the the users who click the adverts.#

#Data relevance

The appropriateness of the data will be addressed by checking:

- whether the data is accurate?
- whether the dataset is enough to sufficiently address the problem at hand?
- whether the dtaset was biased or imbalanced? # Experimental design:
- loading and previewing the dataset
- Cleaning, checking for outliers
- Conducting exploratory data analysis to find out patterns and relationships
- Comunicating the obsertavtions and findings
- Drawing conclusion

#Challenging the solution. More analysis need to be done to clearly predict the person likely to click on the Ad, this may include modeling for instance incorporating a logistic regression model.

##Loading the dataset

```
data <- read.csv('advertising.csv')</pre>
head(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
                        74.15 29
## 4
                                     54806.18
                                                             245.89
                        68.37 35
## 5
                                     73889.99
                                                             225.58
## 6
                        59.99 23
                                      59761.56
                                                             226.74
##
                             Ad.Topic.Line
                                                      City Male
                                                                   Country
## 1
        Cloned 5thgeneration orchestration
                                               Wrightburgh
                                                              0
                                                                   Tunisia
        Monitored national standardization
## 2
                                                 West Jodi
                                                              1
                                                                     Nauru
```

```
## 3 Organic bottom-line service-desk Davidton
                                                                0 San Marino
## 4 Triple-buffered reciprocal time-frame West Terrifurt
                                                                1
                                                                       Italy
             Robust logistical utilization South Manuel 0 narable client-driven software Jamieberg 1
                                                                     Iceland
## 6
           Sharable client-driven software
                                                                      Norway
               Timestamp Clicked.on.Ad
##
## 1 2016-03-27 00:53:11
## 2 2016-04-04 01:39:02
## 3 2016-03-13 20:35:42
## 4 2016-01-10 02:31:19
## 5 2016-06-03 03:36:18
                                       0
## 6 2016-05-19 14:30:17
```

Understanding the datatypes for our features

```
str(data)
## 'data.frame':
                  1000 obs. of 10 variables:
## $ Daily.Time.Spent.on.Site: num 69 80.2 69.5 74.2 68.4 ...
## $ Age
                          : int 35 31 26 29 35 23 33 48 30 20 ...
## $ Area.Income
                            : num 61834 68442 59786 54806 73890 ...
## $ Daily.Internet.Usage : num 256 194 236 246 226 ...
## $ Ad.Topic.Line
                            : Factor w/ 1000 levels "Adaptive 24hour
Graphic Interface",..: 92 465 567 904 767 806 223 724 108 455 ...
## $ City
                            : Factor w/ 969 levels
"Adamsbury", "Adamside", ...: 962 904 112 940 806 283 47 672 885 713 ...
## $ Male
                            : int 0101010111...
## $ Country
                            : Factor w/ 237 levels "Afghanistan",..: 216
148 185 104 97 159 146 13 83 79 ...
## $ Timestamp
                            : Factor w/ 1000 levels "2016-01-01
02:52:10",..: 440 475 368 57 768 690 131 334 549 942 ...
## $ Clicked.on.Ad : int 000000100...
```

Finding any missing values

```
colSums(is.na(data))
## Daily.Time.Spent.on.Site
                                                    Age
                                                                      Area.Income
##
                                                                                0
##
       Daily.Internet.Usage
                                         Ad.Topic.Line
                                                                             City
##
##
                                               Country
                        Male
                                                                        Timestamp
##
                                                                                0
##
              Clicked.on.Ad
##
```

Exploratory Data Analysis

Univariate analysis:

*we will be analysis individual featutres to find interesting facts about them. The features include; Daily. Time. Spent. on. Site, Age, Area. Income, Male and daily time spent on the ineternet.

```
summary(data)
## Daily.Time.Spent.on.Site
                                  Age
                                               Area.Income
Daily.Internet.Usage
## Min.
           :32.60
                             Min.
                                     :19.00
                                              Min.
                                                     :13996
                                                              Min.
                                                                     :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
##
           :65.00
                                     :36.01
                                                     :55000
                                                                     :180.0
   Mean
                             Mean
                                              Mean
                                                              Mean
##
   3rd Ou.:78.55
                             3rd Ou.:42.00
                                              3rd Ou.:65471
                                                              3rd Ou.:218.8
           :91.43
                                     :61.00
                                                     :79485
                                                                     :270.0
##
   Max.
                             Max.
                                              Max.
                                                              Max.
##
##
                                    Ad.Topic.Line
                                                                City
## Adaptive 24hour Graphic Interface
                                                                     3
                                               1
                                                   Lisamouth
##
   Adaptive asynchronous attitude
                                               1
                                                   Williamsport
                                                                     3
   Adaptive context-sensitive application :
                                                                     2
##
                                                   Benjaminchester:
## Adaptive contextually-based methodology:
                                               1
                                                   East John
                                                                     2
   Adaptive demand-driven knowledgebase
                                                                     2
##
                                                   East Timothy
   Adaptive uniform capability
                                                   Johnstad
                                                                     2
##
                                               1
##
    (Other)
                                            :994
                                                   (Other)
                                                                  :986
##
         Male
                              Country
                                                        Timestamp
Clicked.on.Ad
                    Czech Republic: 9
## Min.
          :0.000
                                          2016-01-01 02:52:10:
                                                                    Min.
:0.0
                                          2016-01-01 03:35:35:
## 1st Qu.:0.000
                    France
                                     9
                                                                1
                                                                    1st
Qu.:0.0
## Median :0.000
                    Afghanistan
                                                                    Median
                                     8
                                          2016-01-01 05:31:22:
:0.5
## Mean
           :0.481
                    Australia
                                   : 8
                                          2016-01-01 08:27:06:
                                                                1
                                                                    Mean
:0.5
## 3rd Qu.:1.000
                    Cyprus
                                          2016-01-01 15:14:24:
                                                                1
                                                                    3rd
                                   : 8
Qu.:1.0
## Max.
                    Greece
                                          2016-01-01 20:17:49:
           :1.000
                                   : 8
                                                                    Max.
:1.0
##
                    (Other)
                                  :950
                                          (Other)
                                                             :994
```

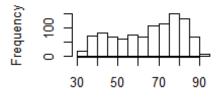
Finding outliers

could not find any outliers

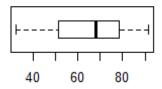
```
Dt_spent <- data$Daily.Time.Spent.on.Site
dt_clicked <- data$Clicked.on.Ad</pre>
```

```
par(mfrow=c(2,2))
hist(Dt_spent,xlab = 'daily time spent on the site', main = 'daily time spent
on the site')
boxplot(Dt_spent,xlab = 'daily time spent on the site', horizontal=TRUE)
hist(dt_clicked, xlab = 'clicked on the Ad', ylab = 'freuency',main = 'clicks
on the Ad')
boxplot(dt_clicked, xlab = 'clicked on the Ad', ylab = 'freuency',
horizontal=TRUE)
```

daily time spent on the site

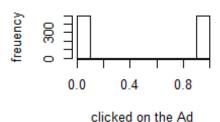


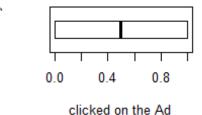
daily time spent on the site



daily time spent on the site

clicks on the Ad





on Average people

spent an 65 minutes on the site on a daily basis and a maximum of 88 minutes. clicks on the the Ad are balanced, the number of people who clicked and those who did not click on the AD are equal.

```
library(e1071)
skewness(data$Clicked.on.Ad)

## [1] 0

skewness(data$Daily.Time.Spent.on.Site)

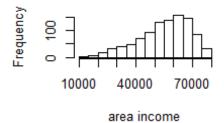
## [1] -0.370646
```

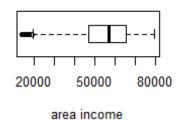
conclusion: 'clicked.on.Ad' and 'Daily.time.Spent.on.Site' features have no skewness.

```
a_income <- data$Area.Income
d_internet_usage <- data$Daily.Internet.Usage
par(mfrow=c(2,2))
hist(a_income,xlab = 'area income', main = 'income')</pre>
```

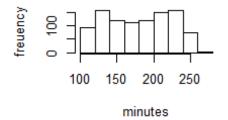
```
boxplot(a_income, xlab = 'area income', horizontal=TRUE)
hist(d_internet_usage, xlab = 'minutes', ylab = 'freuency', main = 'Daily
internet usage')
boxplot(d_internet_usage, xlab = 'minutes', ylab = 'freuency',
horizontal=TRUE)
```

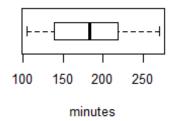
income





Daily internet usage





```
boxplot.stats(data$Area.Income)$out
## [1] 17709.98 18819.34 15598.29 15879.10 14548.06 13996.50 14775.50
18368.57
```

The values above are deemed to be outliers in the area income feature as listed above, however they won't be dropped due to the understanding that different countries have different income levels

reuency

```
skewness(data$Daily.Internet.Usage)
## [1] -0.03343681
skewness(data$Area.Income)
## [1] -0.6484229
```

Daily.Internet.Usage and Area.Income features appear to have no skweness. *The maximum area income was approximately 8,000 and an average of between 5,000 and 6,000.Additional area income appears to be skewed to the left

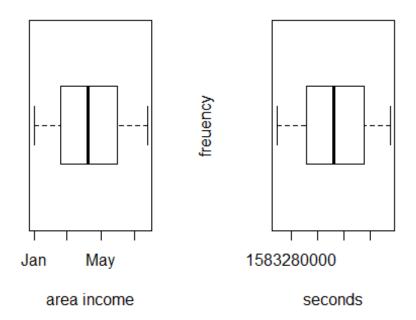
found no outliers in the daily internet usage *The outliers were retained due to the fact that, different countries have different range of income and they appear to be normal, there are low and high income earning countries.

Feature enginering to allow analysis based on time and date. first step was to split the Timestap into 'Date' and 'Time' then conerted them into Date and Time formats respectively*

```
data$Date <- sapply(strsplit(as.character(data$Timestamp), " "), "[", 1)
data$Time <- sapply(strsplit(as.character(data$Timestamp), " "), "[", 2)

date <- as.Date(data$Date)
Time <- as.POSIXct(data$Time,format="%H:%M:%S")

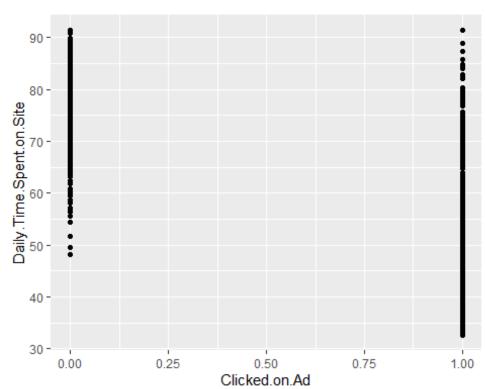
par(mfrow=c(1,2))
#plot.ts(date,xlab = 'area income', main = 'income')
boxplot(date,xlab = 'area income', horizontal=TRUE)
#plot.ts(Time, xlab = 'minutes', ylab = 'freuency',main = 'Daily internet usage')
boxplot(Time, xlab = 'seconds', ylab = 'freuency', horizontal=TRUE)</pre>
```



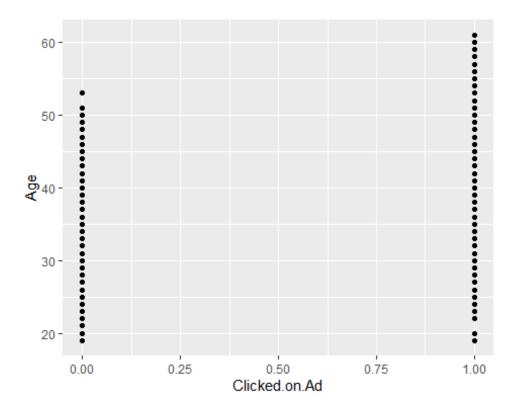
^{*}There were no outliers, for Date and Time. # Bivariate analysis here we will see the relationship between the our dependent variable(Clicked.on.Ad) and the indpendent variables(aily.Time.Spent.on.Site","Age","Area.Income","Daily.Internet.Usage", etc...)

```
colnames(data)
```

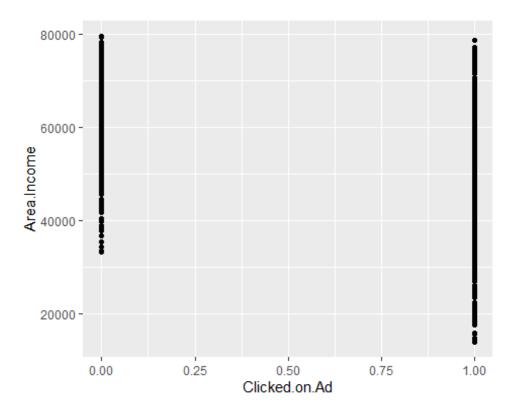
```
[1] "Daily.Time.Spent.on.Site" "Age"
    [3] "Area.Income"
##
                                   "Daily.Internet.Usage"
   [5] "Ad.Topic.Line"
##
                                   "City"
   [7] "Male"
                                   "Country"
##
## [9] "Timestamp"
                                   "Clicked.on.Ad"
## [11] "Date"
                                   "Time"
library(ggplot2)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
par(mfrow=c(2,2))
#ggplot(data = data, aes(x = Daily.Time.Spent.on.Site , fill =
Clicked.on.Ad))+ #geom_histogram(bins= 20, colours = 'cyan')
ggplot(data = data) +
 geom_point(mapping = aes(x = Clicked.on.Ad , y= Daily.Time.Spent.on.Site))
```

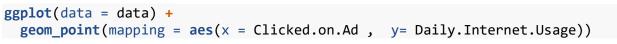


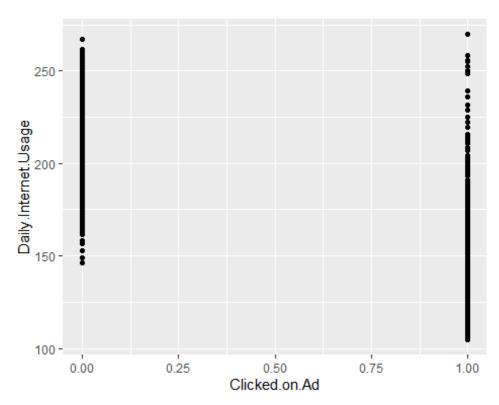
```
ggplot(data = data) +
geom_point(mapping = aes(x = Clicked.on.Ad , y= Age))
```



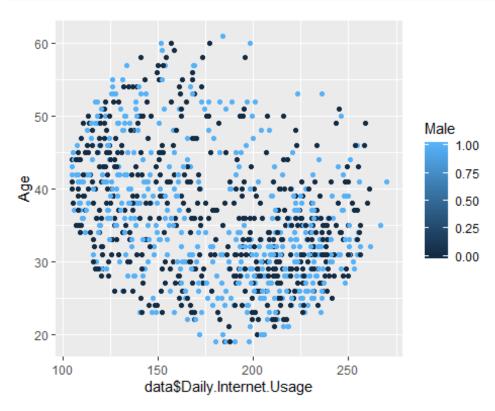
```
ggplot(data = data) +
  geom_point(mapping = aes(x = Clicked.on.Ad , y= Area.Income))
```







```
ggplot(data = data) +
   geom_point(mapping = aes(x = data$Daily.Internet.Usage , y= Age, fill =
Male, colour = Male))
```



users who spend less than 50 minutes in the site on a daily basis are more likely to click on the Ads. While people with less than 150 minutes on the internet are more likely to click on the Ads. Users range between 25 and 60 year are from both genders. Age does not have much influence on the likelihood of one clicking the Ads, however, older people above 50 years are more likely to click on the Ads. people from low area income of below 3,000 are more likely to click on the Ads

```
factor <- factor(data$Country)</pre>
as.numeric(factor)
##
      [1] 216 148 185 104
                           97 159 146 13 83
                                               79 172
                                                                27
                                                                    19 198 162
                                                        35
                                                            61
1
##
          30 175
                  37
                      37
                           35 112 213 140 220
                                                81
                                                    31
                                                        28 166
                                                                12 129 188
                                                                            58
123
##
     [37] 142 222 178 119 175 216 218 178 155 218 172 199 215 104
                                                                            89
138
##
     [55] 217
              52 103 202
                           15 100
                                   35 183
                                           35
                                                33
                                                   45
                                                        38 176 219 216 157
                                                                             28
219
                           68 172 101 222 139 154 143 211
##
     [73] 49 217
                   86
                       51
                                                           28 171
                                                                            13
233
##
     [91] 107 171 184
                       81
                            8
                                2
                                   95 122
                                           61 18 234 189 129
                                                                55
                                                                    87 209
                                                                            25
45
    [109] 88 138 126 117 64 90 215 107 223 133 195 25 81 23 164 229 196
##
```

```
61
   [127] 96 67 58 107 122 181 53 225 22 22 8 183 113 210 80 93 112
##
178
## [145] 219 55 150 20 58 196 153 212 110 161 211 36
                                                      22
                                                          53 50 121 112
222
           6 148 63 141 202 211 29 42 170 127 172 192 88 109 113 176 44
##
   [163]
28
   [181] 232 86 166 136 184 192 105 16
                                        38
                                             3 69 110
                                                       10
                                                           28 167 188 201
##
119
                    10 77 108 187 196 52 69 13 186
##
   [199] 85 223
                  9
                                                       69
                                                           54 114 160 190
184
                     43 169 65 218 116 69 217 109 17
##
         33 134
                 55
                                                       46
                                                           32 207 189 182
   [217]
13
## [235] 42 159 219
                     70 196 133
                                  1 138
                                        74 167
                                                 3 185 87 191 208 121 60
205
                                     2 74 164 121 210 128 135
##
   [253] 139 70
                 71 231 53 166 217
82
## [271] 186 188 84 21 103 94 65 165 114 134 72 158 117 182
                                                                  14 214
214
## [289] 74 189 152 207 226 144 201 125 233 43 75 75 93 190 136 221 36
         37 195 117 182 58 96 207 180 156
                                           71 54
                                                   74
                                                       50
                                                           14 236
##
   [307]
                                                                   48 226
168
##
   [325]
          22
              7 196 192
                        70 133 37 204 152 27 192 67
                                                       27 135
                                                               99
137
##
   [343]
         80
              91
                 67
                     64
                         95
                            76 19 148 166 62 120 36 177 173
                                                                9 184
                                                                        1
15
                     96
                             55 202
                                     1 176 163 184 225 81 51 160
##
   [361] 167
              6
                   2
                         68
166
   [379] 110 42 114
                      2
                         75
                             59 237
                                    52 36 141 94 126 172 44
                                                               18 203 209
##
64
##
   [397]
         38 179
                 34 220
                         62 126
                                18
                                     4 116 139
                                                 7 18 68 207
16
                         97 161 120 109 72 220 48 224 123 73 164 129 236
   [415]
         50 146 151
                     55
##
49
                         17 171 43 26 189 128 65 82 215 210 167 156
##
   [433] 48 188 146
                     59
6
##
   [451]
         61
             69 170
                     14 78 163 226 45 63 138 131 60 200 115 183 205 198
219
##
   [469]
          99
              49
                 13
                     70 160 101 64
                                    71 14
                                           92 234 119 59 214 115 226
99
                                73 87 102 93 62 44 146 124 13 227 137
##
   [487]
          52
             32
                  4 151 210 81
57
                            76
                                  3 171 157 217 88 139 81
   [505] 51 130 105 174 40
                                                           4
                                                              94 141
##
66
                                               19 73 228 228
   [523] 199 144 223 234 234 36 153 13
                                        33 120
##
                                                               29 231 146
131
##
   [541] 105 17
                  3 220 77 36 85 209
                                        99 195 22 189
                                                       13
                                                           85
                                                               45 164 16
47
## [559] 234 154 85 230 26 127 231 149 224 2 126 90 235 98 171 227 9
```

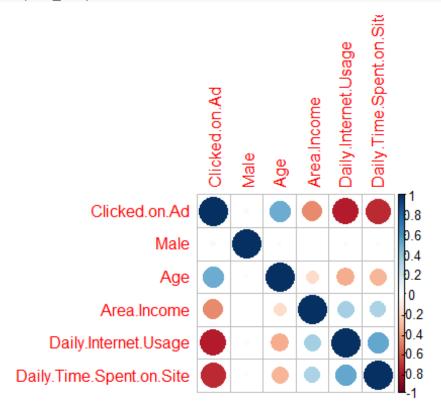
```
72
   [577] 9 218 94 190 54 182 169 207 51 138 119 187 149 79 100 153 120
##
199
## [595] 223 99 183 141 94 164 114 66 176 114 83 212 160 67 107 40 196
138
   [613] 208
             26
                 37 60 236 89 138
                                   16 39 73 187 71 35 116 144 231 161
##
102
                                   26 23 233 15 141 56 175 29 66 90
## [631] 166 21
                 52
                    71 194 166 20
66
## [649] 135 57 206 181 151 81 126 188 34 55 115 151 172
                                                           5 121 44 232
208
   [667] 64 140 103 96 192 53 173 236 75 58 16 213 218
##
                                                          21 72 133 73
60
## [685] 171 223 34 123 105
                           8 44 234 117 95 230 230 86 82 206 178 117
131
   [703] 45 222 131 104 106 135 217 147 44 150 80 48 188 96 168 193 227
##
140
   [721] 170 217 221 157 156 222 230 225 11 204 211 74 70 183 188 35 16
##
204
## [739] 202 214 112 114 50 121 237 50 96 69 150 204 19 165 104 20 197
7
## [757] 191 181 221 187 82 231 119 130 27
                                           32 197 55
                                                     62 213 71
                                                                75 33
34
##
   [775] 136 195
                  2 26 107 31 178 27 98 77 225 111 79 184 100
121
##
   [793] 83 169 110 100 21 147 54 106 237 5 123 54 217 95 150 227 132
234
   [811] 183 226 6 40 203 233 237 42 181 176 139 75 56 202 169 69 167
##
232
   [829] 107 99 162 116 131 1 14 138 137 43 53 20 127
                                                           1 123 196 149
##
198
## [847] 95 193 40 221 230
                            7 205 237 228 119 61 81 17 199 109
169
## [865] 7 41 137 212 11 154 64 38 52 205 235 213 11 63 19
                                                                  4 180
3
## [883] 218 136 196 124 71 63 130 136 160 84 56 153 151 20 207
                                                                 62 207
166
## [901] 119  35  124  231  123  104  185  126  157  230  216  165  125  92  66
                                                                 62 155
211
   [919] 228 195 128 112 115 16 90 66 27 54 192 59 24 105 177
##
237
## [937] 77 29 206 162 83
                           79
                               32 122 129 118 55 97 167 40 91
223
                                   36 20 90 130 100 33
## [955] 101 38 202 131 200 60 188
                                                           1 119 151 95
161
## [973] 127 228 54 137 155 71 106 157 33 229 137 32 71 235 158 169 17
182
## [991] 214 47 142 102 136 117 27 141 86 29
summary(data)
```

```
## Daily.Time.Spent.on.Site
                                  Age
                                               Area.Income
Daily.Internet.Usage
## Min.
           :32.60
                                    :19.00
                                                     :13996
                                                                     :104.8
                             Min.
                                              Min.
                                                              Min.
                             1st Qu.:29.00
                                              1st Qu.:47032
##
   1st Qu.:51.36
                                                              1st Qu.:138.8
                                                              Median :183.1
   Median :68.22
                             Median :35.00
                                              Median :57012
##
##
   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
                                    :61.00
##
   Max.
           :91.43
                             Max.
                                              Max.
                                                     :79485
                                                              Max.
                                                                     :270.0
##
                                    Ad.Topic.Line
                                                                City
##
## Adaptive 24hour Graphic Interface
                                                                     3
                                               1
                                                   Lisamouth
## Adaptive asynchronous attitude
                                               1
                                                   Williamsport
                                                                     3
   Adaptive context-sensitive application :
                                                   Benjaminchester:
##
                                               1
                                                                     2
## Adaptive contextually-based methodology:
                                               1
                                                   East John
                                                                     2
   Adaptive demand-driven knowledgebase
                                               1
                                                   East Timothy
                                                                     2
## Adaptive uniform capability
                                                                     2
                                               1
                                                   Johnstad
##
    (Other)
                                            :994
                                                   (Other)
                                                                  :986
         Male
##
                              Country
                                                        Timestamp
Clicked.on.Ad
                    Czech Republic: 9
## Min.
           :0.000
                                         2016-01-01 02:52:10:
                                                                    Min.
:0.0
## 1st Qu.:0.000
                    France
                                     9
                                          2016-01-01 03:35:35:
                                                                    1st
Qu.:0.0
## Median :0.000
                    Afghanistan
                                   : 8
                                          2016-01-01 05:31:22:
                                                                1
                                                                    Median
:0.5
## Mean
           :0.481
                    Australia
                                     8
                                         2016-01-01 08:27:06:
                                                                1
                                                                    Mean
:0.5
## 3rd Qu.:1.000
                    Cyprus
                                   : 8
                                          2016-01-01 15:14:24:
                                                                1
                                                                    3rd
Qu.:1.0
## Max.
           :1.000
                    Greece
                                   : 8
                                          2016-01-01 20:17:49:
                                                                    Max.
:1.0
##
                    (Other)
                                   :950
                                          (Other)
                                                             :994
##
        Date
                           Time
  Length:1000
                       Length:1000
##
   Class :character
                       Class :character
##
   Mode :character
                       Mode :character
##
##
##
##
##
```

#multivariate Analysis here we explore simultenously explore how other (more than 1) indpendent variabel influence the likelihood of one clicking the Ad.

```
sub_data <- c('Clicked.on.Ad', 'Male', 'Age', 'Area.Income',
'Daily.Internet.Usage', 'Daily.Time.Spent.on.Site')
num <- data[,sub_data]
num_cor <- cor(num)
library(corrplot)</pre>
```

corrplot(num_cor)



- There is a strong positive correlation between Age and the those who clicked the AD,hence the older the user the more likely he/she will click the ad.*
- Daily inter usage and Daily time spent o the site has a strong negative correlation to Clicking the Ad.Thus, the less time one spents on both the site and the internet he/she will be more likely to click on the Ads.*
- Gender(Rep' by 'Male') has no correlation to the likelihood of one clicking the Ad.*
- Area income as weak positive corelation with the the likelihood of one clicking the Ad, suggesting that, the higher the area income the more likely that the person will clkick on the Ad.*