Consumer Behaviour Analytics Tutorial - Practical Case

Statement

Using data/LondonCustomer.csv which contains the following information of the clients of a London bank:

- CONTACT_ID: client ID.
- AGE: age.
- FAMILYSIZE: family size.
- YEAREXPERIENCE: year of experience.
- ANNUALINCOME: annual income.
- EDUCATIONLEVEL ID: education level ID.
- NETPRICE PRO11 AMT: total consume of PRO11 product.
- NETPRICE PRO12 AMT: total consume of PRO12 product.
- NETPRICE PRO13 AMT: total consume of PRO13 product.
- NETPRICE_PRO14_AMT: total consume of PRO14 product.
- NETPRICE_PRO15_AMT: total consume of PRO15 product.
- NETPRICE_PRO16_AMT: total consume of PRO16 product.
- NETPRICE_PRO17_AMT: total consume of PRO17 product.
- name: office's name of London district where it belongs.

With data/London_sports data the following business cases have to be resolved:

Section 1. Company has 33 offices in London, each one per district, and in light of lack of profitability it need close three of these offices. Company has decided that it will do it with offices which has a lower business volume (sum of all products's consume) of clients lower than 55 years.

Section 2. Also, Company wants to know, for each closed districts, if there is an office or offices locate in a near district where it can move the clients if it is necessary. For that, it is considered that the offices are geolocated in the center of the its districts.

0. Read Data

0.0. Clean all and import libraries

```
# Clear all object
rm(list=ls())
# Set working directory
setwd("/home/jmssalas/git/master-bigdata-businessanalytics/08-analytical-applications/03-location-analy
# Import needed libraries
is.installed <- function(package) is.element(package, installed.packages())

if (!is.installed('rgdal'))
   install.packages('rgdal', dependencies = T)

if (!is.installed('rgeos'))
   install.packages('rgeos', dependencies = T)

if (!is.installed('tmap'))
   install.packages('tmap', dependencies = T)</pre>
```

```
if (!is.installed('OpenStreetMap'))
  install.packages('OpenStreetMap', dependencies = T)
library(rgdal)
## Loading required package: sp
## rgdal: version: 1.3-6, (SVN revision 773)
## Geospatial Data Abstraction Library extensions to R successfully loaded
## Loaded GDAL runtime: GDAL 2.2.3, released 2017/11/20
## Path to GDAL shared files: /usr/share/gdal/2.2
## GDAL binary built with GEOS: TRUE
## Loaded PROJ.4 runtime: Rel. 4.9.3, 15 August 2016, [PJ_VERSION: 493]
## Path to PROJ.4 shared files: (autodetected)
## Linking to sp version: 1.3-1
library(rgeos)
## rgeos version: 0.4-2, (SVN revision 581)
## GEOS runtime version: 3.6.2-CAPI-1.10.2
## Linking to sp version: 1.3-1
## Polygon checking: TRUE
library(tmap)
library(OpenStreetMap)
```

0.1 From LondonCustomer CSV

```
london_customer <- read.csv("data/LondonCustomer.csv", sep = ";", header = T)
head(london_customer)</pre>
```

```
CONTACT ID AGE FAMILYSIZE YEAREXPERIENCE ANNUALINCOME EDUCATIONLEVEL ID
## 1
            395 25
                               4
                                               1
## 2
            396 45
                               3
                                              19
                                                            34
                                                                                1
            397 39
## 3
                               1
                                              15
                                                            11
                                                                                1
## 4
            398 35
                               1
                                               9
                                                           100
                                                                                2
## 5
            399 35
                               4
                                               8
                                                                                2
                                                            45
## 6
            400 37
                               4
                                              13
                                                            29
                                                                                2
     NETPRICE_PRO11_AMT NETPRICE_PRO12_AMT NETPRICE_PRO13_AMT
##
## 1
                       0
                                            1
                       0
## 2
                                            1
                                                                0
## 3
                       0
                                            0
                                                                0
## 4
                       0
                                            0
                                                                0
## 5
                       0
                                            0
                                                                0
## 6
                     155
                                            0
     NETPRICE_PRO14_AMT NETPRICE_PRO15_AMT NETPRICE_PRO16_AMT
##
## 1
                      16
## 2
                      15
                                            0
                                                                0
## 3
                      10
                                            0
                                                                0
## 4
                      27
                                                                0
                                            0
## 5
                      10
                                            1
                                                                0
## 6
                                            0
                                                                1
##
     NETPRICE_PRO17_AMT
                                          name
## 1
                                      Lewisham
                       0
## 2
                       0
                                       Enfield
```

```
## 3 0 Waltham Forest
## 4 0 Barking and Dagenham
## 5 0 Hackney
## 6 0 Barnet
```

0.2. From London Sport SHP file

```
# Get London data in SHP format
i_data_gs <- readOGR(dsn = "data", layer = "london_sport")</pre>
## OGR data source with driver: ESRI Shapefile
## Source: "/home/jmssalas/git/master-bigdata-businessanalytics/08-analytical-applications/03-location-
## with 33 features
## It has 4 fields
## Integer64 fields read as strings: Pop_2001
i_data_gs@data$Pop_2001 <- as.numeric(as.character(i_data_gs@data$Pop_2001))
head(i_data_gs@data)
##
     ons_label
                                name Partic_Per Pop_2001
## 0
          OOAF
                             Bromley
                                           21.7
                                                  295535
## 1
          00BD Richmond upon Thames
                                           26.6
                                                  172330
## 2
                                           21.5
                                                  243006
          OOAS
                         Hillingdon
## 3
          OOAR
                           Havering
                                           17.9
                                                  224262
## 4
                                           24.4
                                                  147271
          00AX Kingston upon Thames
## 5
          00BF
                              Sutton
                                           19.3
                                                  179767
```

Section 1.

1.1. Get the clients which has a age lower than 55

```
clients_lower_55 <- london_customer[london_customer$AGE < 55, ]</pre>
max(clients_lower_55$AGE)
## [1] 54
head(clients_lower_55)
     CONTACT ID AGE FAMILYSIZE YEAREXPERIENCE ANNUALINCOME EDUCATIONLEVEL ID
## 1
             395 25
                               4
                                               1
                                                             49
                                                                                 1
                               3
## 2
             396 45
                                               19
                                                             34
                                                                                  1
## 3
             397 39
                               1
                                               15
                                                             11
                                                                                 1
                                                                                 2
                                                            100
## 4
             398
                  35
                               1
                                                9
## 5
             399 35
                               4
                                                8
                                                             45
                                                                                 2
                                                                                 2
## 6
             400 37
                               4
                                               13
     NETPRICE_PRO11_AMT NETPRICE_PRO12_AMT NETPRICE_PRO13_AMT
## 1
                       0
                                            1
## 2
                       0
                                            1
                                                                 0
## 3
                        0
                                            0
                                                                 0
                                                                 0
## 4
                       0
                                            0
## 5
                       0
                                            0
                                                                 0
## 6
                     155
                                            0
                                                                 0
```

```
NETPRICE_PR014_AMT NETPRICE_PR015_AMT NETPRICE_PR016_AMT
## 1
                       16
## 2
                       15
                                             0
                                                                  0
                       10
                                             0
                                                                  0
## 3
## 4
                       27
                                             0
                                                                  0
## 5
                       10
                                                                  0
                                             1
## 6
                                             0
                                                                  1
##
     NETPRICE PRO17 AMT
                                            name
## 1
                                        Lewisham
## 2
                        0
                                         Enfield
## 3
                        0
                                 Waltham Forest
## 4
                        O Barking and Dagenham
                                         Hackney
## 5
                        0
## 6
                        0
                                          Barnet
```

1.1. Get the sum of all products's consume

```
# Products
products <- c("NETPRICE PR011 AMT", "NETPRICE PR012 AMT", "NETPRICE PR013 AMT", "NETPRICE PR014 AMT", "
Let's use the str() function to discover the products values:
str(clients_lower_55[, products])
                     3641 obs. of 7 variables:
## 'data.frame':
##
    $ NETPRICE_PR011_AMT: int  0 0 0 0 0 155 0 0 104 0 ...
## $ NETPRICE_PR012_AMT: int 1 1 0 0 0 0 0 0 0 ...
  $ NETPRICE_PRO13_AMT: int 0 0 0 0 0 0 0 0 0 ...
  $ NETPRICE_PR014_AMT: Factor w/ 108 levels "0","1","10","100",...: 11 10 3 27 3 45 10 31 73 105 ...
   $ NETPRICE_PR015_AMT: int 0 0 0 0 1 0 0 1 0 0 ...
   $ NETPRICE_PR016_AMT: int  0 0 0 0 0 1 1 0 1 0 ...
   $ NETPRICE_PR017_AMT: int 0 0 0 0 0 0 0 0 1 ...
# Let's see the factor's levels
levels(clients_lower_55$NETPRICE_PR014_AMT)
     [1] "0"
                 "1"
                        "10"
                               "100"
                                       "11"
                                              "12"
                                                      "13"
                                                             "13,3" "14"
                                                                            "15"
##
    [11] "16"
                 "16,7" "17"
                               "17,5" "18"
                                              "19"
                                                      "2"
                                                             "20"
                                                                     "21"
                                                                            "22"
##
                               "25"
    [21] "23"
                 "23,3" "24"
                                       "26"
                                              "26,7"
                                                      "27"
                                                             "27,5" "28"
                                                                            "29"
##
    [31] "3"
                               "32"
                                       "32,5" "33"
                                                             "34"
                                                                     "35"
                                                                            "36"
##
                 "30"
                        "31"
                                                      "33,3"
##
    [41] "36,7" "37"
                        "38"
                               "39"
                                       "4"
                                              "40"
                                                      "41"
                                                             "42"
                                                                     "42,5" "43"
   [51] "43,3" "44"
                        "45"
                               "46"
                                       "46,7" "47"
                                                      "47,5"
                                                             "48"
                                                                     "49"
                                                                            "5"
##
    [61] "50"
                 "51"
                        "52"
                               "53"
                                       "53,3" "54"
                                                      "55"
                                                             "56"
                                                                     "56,7" "57"
                        "6"
    [71] "58"
                 "59"
                               "6,7"
                                       "60"
                                              "61"
                                                      "62"
                                                             "63"
                                                                     "63,3" "64"
##
                 "66"
                        "66.7" "67"
                                       "68"
                                              "69"
                                                      "7"
                                                             "7.5"
                                                                     "70"
                                                                            "72"
##
    [81] "65"
##
    [91] "73"
                 "74"
                        "75"
                               "76"
                                       "78"
                                              "79"
                                                      "8"
                                                             "80"
                                                                     "81"
                                                                            "82"
## [101] "83"
                 "85"
                        "86"
                               "88"
                                       "89"
                                              "9"
                                                      "90"
                                                             "93"
```

As we can see, the NETPRICE_PRO14_AMT column is not a numeric value. So, we have to convert this factor value to numeric value, using first gsub() function to replace, to ..

```
clients_lower_55$NETPRICE_PR014_AMT <- as.double(gsub(",", ".", clients_lower_55$NETPRICE_PR014_AMT))
str(clients_lower_55[, products])</pre>
```

'data.frame': 3641 obs. of 7 variables:

```
## $ NETPRICE PRO11 AMT: int 0 0 0 0 155 0 0 104 0 ...
## $ NETPRICE_PR012_AMT: int
                               1 1 0 0 0 0 0 0 0 0 ...
## $ NETPRICE PRO13 AMT: int
                                0 0 0 0 0 0 0 0 0 0 ...
## $ NETPRICE_PRO14_AMT: num
                               16 15 10 27 10 4 15 3 6 89 ...
## $ NETPRICE_PR015_AMT: int
                                0 0 0 0 1 0 0 1 0 0 ...
## $ NETPRICE PRO16 AMT: int 0 0 0 0 0 1 1 0 1 0 ...
## $ NETPRICE PRO17 AMT: int 0 0 0 0 0 0 0 0 1 ...
Now, we can already make the sum of all products
clients lower 55$SUM CONSUME <- rowSums(clients lower 55[, products])
head(clients_lower_55[,c(products, "SUM_CONSUME")])
     NETPRICE_PRO11_AMT NETPRICE_PRO12_AMT NETPRICE_PRO13_AMT
##
## 1
                      0
## 2
                       0
                                          1
                                                              0
                      0
                                          0
## 3
                                                              0
                       0
## 4
                                          0
                                                              0
## 5
                       0
                                          0
                                                              0
## 6
                     155
                                                              0
                                          0
     NETPRICE_PR014_AMT NETPRICE_PR015_AMT NETPRICE_PR016_AMT
## 1
                     16
                                          0
                                                              0
## 2
                      15
                                          0
                                                              0
## 3
                      10
                                          0
                                                              0
## 4
                      27
                                          0
                                                              0
## 5
                      10
                                          1
                                                              0
## 6
     NETPRICE_PR017_AMT SUM_CONSUME
##
## 1
                      0
                                  17
## 2
                      0
                                  16
## 3
                       0
                                  10
## 4
                       0
                                  27
## 5
                      0
                                  11
## 6
                       0
                                 160
```

1.2. Get the three offices which have a lower business volume

Import dplyr library

```
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:rgeos':
##
## intersect, setdiff, union
## The following objects are masked from 'package:stats':
##
## filter, lag
## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

```
# Get the sum of all product's consumes of all clients of each districts
clients_lower_55 %>%
  group_by(name) %>%
  summarise(SUM_CONSUME = sum(SUM_CONSUME)) %>%
  arrange(SUM_CONSUME)
```

```
## # A tibble: 33 x 2
##
      name
                             SUM_CONSUME
##
      <fct>
                                   <dbl>
## 1 City of London
                                    62.7
## 2 Wandsworth
                                   501
## 3 Ealing
                                   714
## 4 Bromley
                                   776.
## 5 Hammersmith and Fulham
                                  1011
## 6 Lambeth
                                  1042.
## 7 Haringey
                                  1174
## 8 Greenwich
                                  1223.
## 9 Hounslow
                                  2162
## 10 Southwark
                                  2825.
## # ... with 23 more rows
```

With that, we can say that the three offices which have a lower business volume are:

- City of London
- Wandsworth
- Ealing

Section 2

As we assume that the offices are geolocated in the center of its districts, we are going to get the centroid of each closed office:

```
# Set the closed offices
closed_offices <- c("City of London", "Wandsworth", "Ealing")

# Get its information
i_data_closed_offices <- i_data_gs[is.element(i_data_gs@data$name, closed_offices), ]

# Get the Centroid of these offices
cent_closed_offices <- gCentroid(i_data_closed_offices, byid = T, id = closed_offices)

# Plot the location of theses offices
plot(i_data_gs, col = "lightgrey")
plot(i_data_closed_offices, add = T, col = "orange")
points(cent_closed_offices, cex = 0.5, col = "black", pch = 19)</pre>
```



Now, we are going to get what open offices are near to the closed offices. For that, we are going to assume that a office is near to other if there are 5km between them. First at all, let's get the centroids of all open offices

```
# Get all districts where Company has its offices
districts <- unique(london_customer$name)

# Remove closed offices
open_offices <- districts[!districts %in% closed_offices]

# Get its information
i_data_open_offices <- i_data_gs[is.element(i_data_gs@data$name, open_offices), ]

# Get the Centroid of these offices
cent_open_offices <- gCentroid(i_data_open_offices, byid = T, id = open_offices)</pre>
```

Now, for each closed offices (using its centroid), we are going to get the near open offices:

```
near_offices = list()

for (closed in closed_offices)
{
    # Get information of the closed office
    i_data_closed_office <- i_data_gs[i_data_gs@data$name == closed, ]

# Get the Centroid of that office
    centroid <- gCentroid(i_data_closed_office)</pre>
```

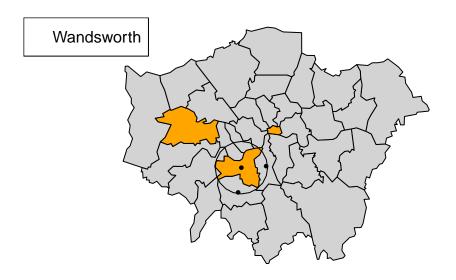
```
# Get the buffer with 5km from each closed office
i_data_closed_offices_buffer <- gBuffer(spgeom = centroid, width = 5000)

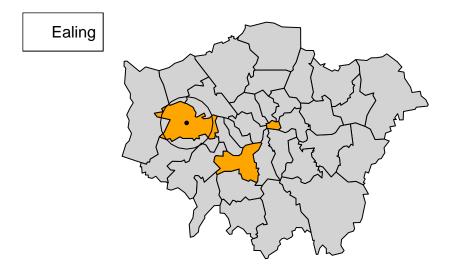
# Get the open offices inside the buffer
cent_open_offices_inside_buffer <- cent_open_offices[i_data_closed_offices_buffer, ]

# Plot the completed graph
plot(i_data_gs, col = "lightgrey")
plot(i_data_closed_offices, add = T, col = "orange")
plot(i_data_closed_offices_buffer, add = T)
points(centroid, cex = 0.5, col = "black", pch = 19)
points(cent_open_offices_inside_buffer, cex = 0.5, col = "black", pch = 19)
legend("topleft", legend = closed)

# Storage the open offices near to closed office
near_offices[[closed]] <- rownames(cent_open_offices_inside_buffer@coords)
}</pre>
```







With that, we already have the offices near to each closed office:

near_offices

```
## $`City of London`
## [1] "Bexley" "Kingston upon Thames"
## [3] "Brent" "Hammersmith and Fulham"
## [5] "Hounslow"
##
## $Wandsworth
## [1] "Redbridge" "Westminster"
```

The offices which are open near to the closed offices are:

- City of London:
 - Bexley
 - Kingston upon Thames
 - Brent
 - Hammersmith and Fulham
 - Hounslow
- Wandsworth:
 - Redbridge
 - Westminster
- Ealing:
 - None