## Part3 Association Rules

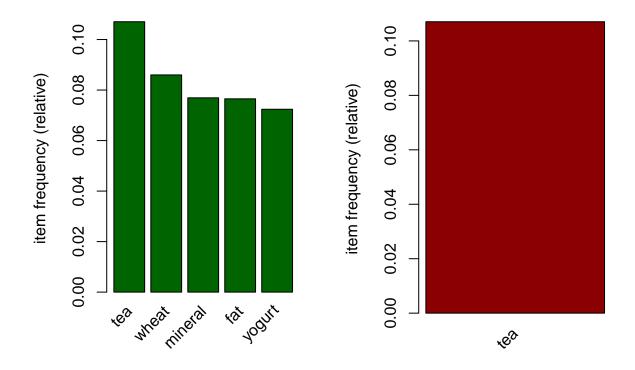
```
install.packages('arules')
## Installing package into '/home/greg/R/x86_64-pc-linux-gnu-library/3.6'
## (as 'lib' is unspecified)
library(arules)
## Loading required package: Matrix
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
##
       abbreviate, write
df <- read.transactions('http://bit.ly/SupermarketDatasetII')</pre>
I'll load the dataset
## Warning in asMethod(object): removing duplicated items in transactions
df
## transactions in sparse format with
## 7501 transactions (rows) and
## 5729 items (columns)
class(df)
## [1] "transactions"
## attr(,"package")
## [1] "arules"
summary(df)
```

```
## transactions as itemMatrix in sparse format with
    7501 rows (elements/itemsets/transactions) and
    5729 columns (items) and a density of 0.0005421748
##
## most frequent items:
##
             wheat mineral
       tea
                                 fat yogurt (Other)
##
       803
                645
                        577
                                 574
                                          543
                                                20157
##
## element (itemset/transaction) length distribution:
  sizes
                                                                      13
##
      1
                 3
                            5
                                 6
                                       7
                                                 9
                                                      10
                                                           11
                                                                 12
                                                                            15
                                                                                 16
## 1603 2007 1382 942
                                    228
                                                           13
                                                                  5
                          651
                               407
                                          151
                                                70
                                                      39
                                                                                  1
                                                                       1
                                                                             1
##
      Min. 1st Qu.
                     Median
                                Mean 3rd Qu.
                                                 Max.
##
     1.000
              2.000
                      3.000
                               3.106
                                        4.000
                                              16.000
##
## includes extended item information - examples:
##
                       labels
## 1
## 2
                  accessories
## 3 accessories, antioxydant
# Previewing our first 5 rows
inspect(df[1:5])
##
       items
   [1] {cheese, energy,
##
##
        drink, tomato,
##
        fat,
##
        flour, yams, cottage,
##
        grapes, whole,
##
        juice, frozen,
##
        juice, low,
##
        mix, green,
##
        oil,
##
        shrimp, almonds, avocado, vegetables,
##
        smoothie, spinach, olive,
##
        tea, honey, salad, mineral,
##
        water, salmon, antioxydant,
##
        weat,
##
        yogurt, green}
   [2] {burgers, meatballs, eggs}
   [3] {chutney}
  [4] {turkey,avocado}
## [5] {bar, whole,
##
        mineral,
##
        rice, green,
##
        tea,
##
        water, milk, energy,
        wheat}
##
```

## **Association Rules**

```
items = as.data.frame(itemLabels(df))
colnames(items) <- "Item"</pre>
head(items, 5)
##
                                Item
## 1
                                   &
## 2
                        accessories
## 3
           accessories, antioxydant
## 4 accessories, champagne, fresh
## 5 accessories, champagne, protein
itemFrequency(df[, 8:10],type = "absolute")
I'll then explore the frequency of the articles
##
       accessories, chocolate, frozen
                                             accessories, chocolate, low
## accessories, chocolate, pasta, salt
##
round(itemFrequency(df[, 8:10],type = "relative")*100,2)
##
       accessories, chocolate, frozen
                                             accessories, chocolate, low
##
                                 0.01
                                                                    0.01
## accessories, chocolate, pasta, salt
##
par(mfrow = c(1, 2))
# plot the frequency of items
itemFrequencyPlot(df, topN = 5,col="darkgreen")
```

itemFrequencyPlot(df, support = 0.1,col="darkred")



```
# Building a model based on association
greg = apriori (df, parameter = list(supp = 0.001, conf = 0.8))
```

```
## Apriori
##
## Parameter specification:
##
   confidence minval smax arem aval original Support maxtime support minlen
##
           0.8
                  0.1
                         1 none FALSE
                                                  TRUE
                                                                 0.001
##
   maxlen target ext
        10 rules TRUE
##
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
##
##
       0.1 TRUE TRUE FALSE TRUE
                                          TRUE
##
## Absolute minimum support count: 7
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[5729 item(s), 7501 transaction(s)] done [0.01s].
## sorting and recoding items ... [354 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [271 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

```
greg
```

## set of 271 rules

```
greg = sort(greg, by="lift", decreasing=TRUE)
inspect(greg[1:10])
```

## I'll then order the rules by level of confidence

```
##
        lhs
                             rhs
                                             support
                                                         confidence coverage
## [1]
        {&,fresh}
                          => {tuna,herb}
                                             0.001199840 0.90
                                                                     0.001333156
## [2]
        {parmesan, wheat} \Rightarrow {cheese, whole} 0.001333156 1.00
                                                                     0.001333156
##
   [3]
        {fat,tea}
                          => {yogurt,green} 0.004666045 1.00
                                                                     0.004666045
## [4]
        {&,grated}
                          => {cheese,herb}
                                             0.004666045 1.00
                                                                     0.004666045
## [5]
        {bar,hand}
                          => {protein}
                                             0.001199840 1.00
                                                                     0.001199840
## [6]
        {flour,green}
                          => {weat}
                                             0.001199840 1.00
                                                                     0.001199840
  [7]
        {flour}
                          => {weat}
##
                                             0.001466471 1.00
                                                                     0.001466471
## [8]
        {flour,french}
                          => {weat}
                                             0.002133049 1.00
                                                                     0.002133049
## [9]
                                             0.003066258 0.92
                                                                     0.003332889
        {candy}
                          => {bars}
  [10] {extra}
                          => {dark}
                                             0.001066524 1.00
                                                                     0.001066524
##
##
        lift
                  count
## [1]
        613.71818 9
## [2]
        258.65517 10
## [3]
        197.39474 35
## [4]
        153.08163 35
## [5]
        144.25000 9
  [6]
        107.15714 9
##
##
   [7]
        107.15714 11
## [8]
        107.15714 16
## [9]
        100.01333 23
## [10]
        83.34444 8
```

## Conclusion

1. Tea and wheat were the most frequent items bought.