smandumu_A3

smandumu

4/18/2020

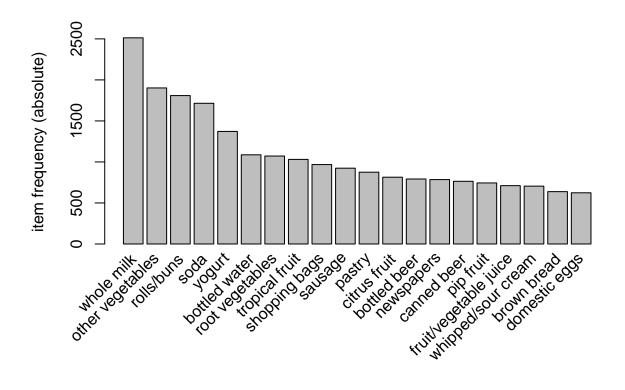
```
library(arules) #Arules, open source package is a powerful tool-set for mining associative rules
## Loading required package: Matrix
##
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
##
       abbreviate, write
library(arulesViz)
## Loading required package: grid
## Registered S3 method overwritten by 'seriation':
     method
                    from
##
    reorder.hclust gclus
groceries <- read.transactions("groceries_v2.csv",header=FALSE,format = "basket",sep = ",")</pre>
## Warning in readLines(file, encoding = encoding): incomplete final line found on
## 'groceries v2.csv'
summary(groceries)
## transactions as itemMatrix in sparse format with
  9834 rows (elements/itemsets/transactions) and
   169 columns (items) and a density of 0.0260911
##
##
## most frequent items:
##
         whole milk other vegetables
                                            rolls/buns
                                                                    soda
##
               2513
                                 1902
                                                   1809
                                                                    1715
##
             yogurt
                              (Other)
                                34051
##
               1372
## element (itemset/transaction) length distribution:
## sizes
                                6
                                                    10
                                                         11
                                                              12
                                                                   13
                                                                         14
                                                                              15
                                                                                   16
## 2159 1643 1299 1005
                        854
                              645
                                   545
                                        438
                                             350
                                                   246
                                                        182
                                                             117
                                                                   78
                                                                        77
                                                                              55
                                                                                   46
##
     17
          18
               19
                    20
                          21
                               22
                                    23
                                         24
                                               26
                                                         28
                                                              29
                                                                   32
     29
                                     6
##
          14
               14
                     9
                          11
                                4
                                          1
                                               1
                                                     1
                                                               3
                                                                    1
##
##
     Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
           2.000
                     3.000
                              4.409
                                      6.000 32.000
##
```

```
##
               labels
## 1 abrasive cleaner
## 2 artif. sweetener
       baby cosmetics
itemLabels(groceries) # The Items list
##
     [1] "abrasive cleaner"
                                      "artif. sweetener"
##
     [3] "baby cosmetics"
                                      "baby food"
     [5] "bags"
##
                                      "baking powder"
                                      "beef"
##
     [7] "bathroom cleaner"
##
     [9] "berries"
                                      "beverages"
##
  [11] "bottled beer"
                                      "bottled water"
##
    [13] "brandy"
                                      "brown bread"
                                      "butter milk"
##
   [15] "butter"
##
   [17] "cake bar"
                                      "candles"
##
   [19] "candy"
                                      "canned beer"
                                      "canned fruit"
##
    [21] "canned fish"
##
  [23] "canned vegetables"
                                      "cat food"
  [25] "cereals"
                                      "chewing gum"
##
   [27] "chicken"
                                      "chocolate"
    [29] "chocolate marshmallow"
                                      "citrus fruit"
##
  [31] "cleaner"
                                      "cling film/bags"
  [33] "cocoa drinks"
                                      "coffee"
## [35] "condensed milk"
                                      "cooking chocolate"
##
  [37] "cookware"
                                      "cream"
## [39] "cream cheese"
                                      "curd"
  [41] "curd cheese"
                                      "decalcifier"
##
##
   [43] "dental care"
                                      "dessert"
                                      "dish cleaner"
##
  [45] "detergent"
  [47] "dishes"
                                      "dog food"
  [49] "domestic eggs"
                                      "female sanitary products"
##
    [51] "finished products"
                                      "fish"
##
                                      "flower (seeds)"
##
  [53] "flour"
  [55] "flower soil/fertilizer"
                                      "frankfurter"
   [57] "frozen chicken"
                                      "frozen dessert"
##
    [59] "frozen fish"
                                      "frozen fruits"
##
  [61] "frozen meals"
                                      "frozen potato products"
  [63] "frozen vegetables"
                                      "fruit/vegetable juice"
##
  [65] "grapes"
                                      "hair spray"
   [67] "ham"
##
                                      "hamburger meat"
  [69] "hard cheese"
                                      "herbs"
##
##
  [71] "honey"
                                      "house keeping products"
##
    [73] "hygiene articles"
                                      "ice cream"
##
                                      "Instant food products"
  [75] "instant coffee"
##
  [77] "jam"
                                      "ketchup"
   [79] "kitchen towels"
                                      "kitchen utensil"
##
   [81] "light bulbs"
                                      "liqueur"
##
  [83] "liquor"
                                      "liquor (appetizer)"
                                      "long life bakery product"
  [85] "liver loaf"
   [87] "make up remover"
                                      "male cosmetics"
##
                                      "mayonnaise"
##
   [89] "margarine"
## [91] "meat"
                                      "meat spreads"
## [93] "misc. beverages"
                                      "mustard"
```

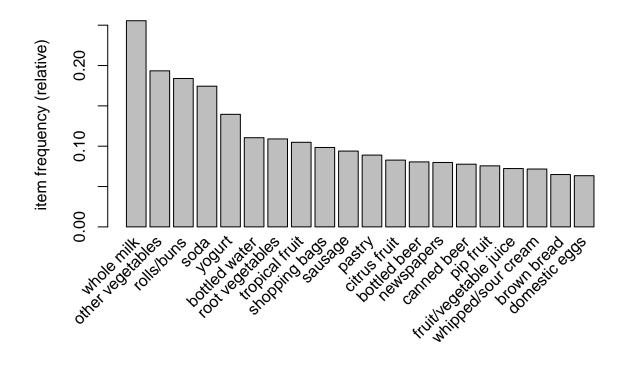
includes extended item information - examples:

```
## [95] "napkins"
                                      "newspapers"
## [97] "nut snack"
                                      "nuts/prunes"
                                      "onions"
## [99] "oil"
## [101] "organic products"
                                      "organic sausage"
## [103] "other vegetables"
                                      "packaged fruit/vegetables"
## [105] "pasta"
                                      "pastry"
## [107] "pet care"
                                      "photo/film"
## [109] "pickled vegetables"
                                      "pip fruit"
## [111] "popcorn"
                                      "pork"
## [113] "pot plants"
                                      "potato products"
## [115] "preservation products"
                                      "processed cheese"
## [117] "prosecco"
                                      "pudding powder"
## [119] "ready soups"
                                      "red/blush wine"
## [121] "rice"
                                      "roll products"
## [123] "rolls/buns"
                                      "root vegetables"
## [125] "rubbing alcohol"
                                      "rum"
                                      "salt"
## [127] "salad dressing"
## [129] "salty snack"
                                      "sauces"
## [131] "sausage"
                                      "seasonal products"
## [133] "semi-finished bread"
                                      "shopping bags"
## [135] "skin care"
                                      "sliced cheese"
## [137] "snack products"
                                      "soap"
## [139] "soda"
                                      "soft cheese"
## [141] "softener"
                                      "sound storage medium"
## [143] "soups"
                                      "sparkling wine"
## [145] "specialty bar"
                                      "specialty cheese"
## [147] "specialty chocolate"
                                      "specialty fat"
## [149] "specialty vegetables"
                                      "spices"
## [151] "spread cheese"
                                      "sugar"
## [153] "sweet spreads"
                                      "syrup"
                                      "tidbits"
## [155] "tea"
## [157] "toilet cleaner"
                                      "tropical fruit"
## [159] "turkey"
                                      "UHT-milk"
## [161] "vinegar"
                                      "waffles"
## [163] "whipped/sour cream"
                                      "whisky"
## [165] "white bread"
                                      "white wine"
## [167] "whole milk"
                                      "yogurt"
## [169] "zwieback"
summary(groceries)
## transactions as itemMatrix in sparse format with
   9834 rows (elements/itemsets/transactions) and
   169 columns (items) and a density of 0.0260911
##
## most frequent items:
         whole milk other vegetables
                                            rolls/buns
                                                                    soda
##
                                 1902
                                                   1809
                                                                    1715
               2513
##
             yogurt
                              (Other)
##
               1372
                                34051
## element (itemset/transaction) length distribution:
## sizes
##
                3
                           5
                                6
                                     7
                                          8
                                                9
                                                    10
                                                         11
                                                              12
                                                                   13
                                                                         14
                                                                              15
                                                                                   16
## 2159 1643 1299 1005 854
                             645
                                  545
                                       438
                                             350
                                                  246 182
                                                            117
                                                                                   46
```

```
##
     17
          18
                19
                     20
                           21
                                22
                                      23
                                           24
                                                 26
                                                           28
                                                                 29
                                                                      32
##
     29
          14
                14
                           11
                                 4
                                       6
                                            1
                                                 1
                                                       1
                                                                  3
                                                                       1
##
##
      Min. 1st Qu.
                     Median
                                Mean 3rd Qu.
                                                 Max.
              2.000
##
                      3.000
                               4.409
                                        6.000
##
## includes extended item information - examples:
                labels
##
## 1 abrasive cleaner
  2 artif. sweetener
## 3
       baby cosmetics
itemFrequencyPlot(groceries,topN=20,type="absolute") #to look into the item frequency
```



itemFrequencyPlot(groceries,topN=20,type="relative") #to look into the item frequency



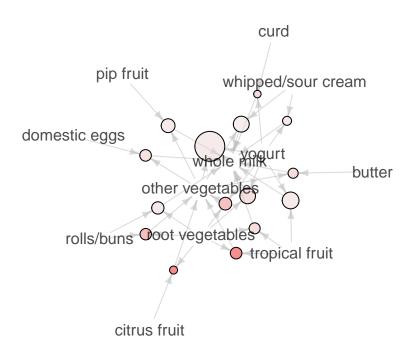
```
# frequent itemsets, association rules using the Apriori algorithm
(gm <- apriori(groceries, parameter=list(support=0.01, confidence=0.5)))</pre>
```

```
## Apriori
##
  Parameter specification:
##
    confidence minval smax arem aval original Support maxtime support minlen
##
           0.5
                         1 none FALSE
                                                  TRUE
                                                                   0.01
##
   maxlen target
                    ext
##
        10 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
                                          TRUE
##
##
## Absolute minimum support count: 98
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9834 transaction(s)] done [0.00s].
## sorting and recoding items ... [88 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [15 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
## set of 15 rules
```

```
summary(gm)
## set of 15 rules
##
## rule length distribution (lhs + rhs):sizes
## 15
##
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                             Max.
                                3
##
        3
                3
                        3
                                        3
##
## summary of quality measures:
                       confidence
##
      support
                                           lift
                                                          count
##
   Min.
          :0.01007
                    Min.
                            :0.5000
                                      Min.
                                             :1.984
                                                      Min. : 99.0
  1st Qu.:0.01174
                    1st Qu.:0.5151
##
                                      1st Qu.:2.036
                                                      1st Qu.:115.5
## Median :0.01230 Median :0.5245
                                      Median :2.203
                                                      Median :121.0
## Mean
         :0.01316
                    Mean
                            :0.5411
                                      Mean
                                             :2.300
                                                      Mean
                                                             :129.4
## 3rd Qu.:0.01403
                     3rd Qu.:0.5718
                                      3rd Qu.:2.432
                                                      3rd Qu.:138.0
## Max. :0.02227
                     Max. :0.5862
                                      Max. :3.031
                                                      Max.
                                                             :219.0
##
## mining info:
##
        data ntransactions support confidence
   groceries
                      9834
                              0.01
                                          0.5
inspect(head(sort(gm, by ="lift"),5))
##
      lhs
                                          rhs
                                                             support
## [1] {citrus fruit,root vegetables}
                                       => {other vegetables} 0.01037218
## [2] {root vegetables, tropical fruit} => {other vegetables} 0.01230425
## [3] {rolls/buns,root vegetables}
                                       => {other vegetables} 0.01220256
## [4] {root vegetables,yogurt}
                                       => {other vegetables} 0.01291438
## [5] {curd,yogurt}
                                       => {whole milk}
                                                             0.01006711
##
      confidence lift
## [1] 0.5862069 3.030893 102
## [2] 0.5845411 3.022280 121
## [3] 0.5020921 2.595990 120
## [4] 0.5000000 2.585174 127
## [5] 0.5823529 2.278893 99
plot(gm,method = "graph")
```

Graph for 15 rules

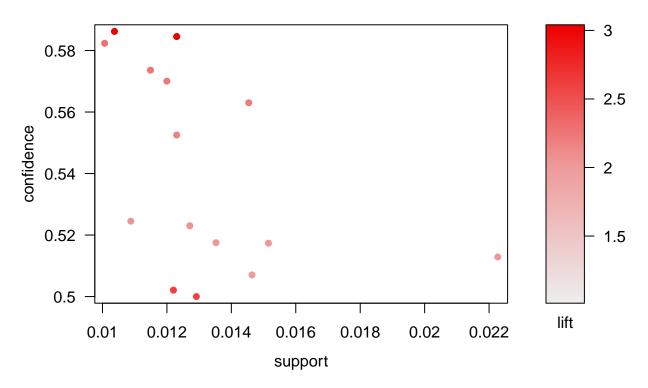
size: support (0.01 – 0.022) color: lift (1.984 – 3.031)



```
#Rules that lead to buying "whole milk"
(wmilk_rules <- apriori(data=groceries, parameter=list (support=0.01,confidence = 0.5), appearance = list
## Apriori
##
## Parameter specification:
   confidence minval smax arem aval original Support maxtime support minlen
##
##
           0.5
                         1 none FALSE
                                                 TRUE
                                                                  0.01
##
   maxlen target
                    ext
##
        10 rules FALSE
##
## Algorithmic control:
  filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
## Absolute minimum support count: 98
##
## set item appearances ...[1 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9834 transaction(s)] done [0.00s].
## sorting and recoding items ... [88 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [11 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
## set of 11 rules
```

```
# Rules wrt Whole Milk
inspect(head(sort(wmilk_rules,by="confidence"),3))
##
      lhs
                                                        support
                                                                   confidence
                                           rhs
## [1] {curd,yogurt}
                                        => {whole milk} 0.01006711 0.5823529
## [2] {butter,other vegetables}
                                       => {whole milk} 0.01149075 0.5736041
## [3] {root vegetables,tropical fruit} => {whole milk} 0.01199919 0.5700483
      lift
                count
## [1] 2.278893 99
## [2] 2.244657 113
## [3] 2.230742 118
#Rules that lead to buying "whole milk" on LHS side
(wmilk_rules <- apriori(data=groceries, parameter=list (support=0.01,confidence = 0.5), appearance = list
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval original Support maxtime support minlen
          0.5
                        1 none FALSE
                 0.1
## maxlen target ext
       10 rules FALSE
##
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
      0.1 TRUE TRUE FALSE TRUE
##
## Absolute minimum support count: 98
## set item appearances ...[1 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9834 transaction(s)] done [0.00s].
## sorting and recoding items ... [88 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 done [0.00s].
## writing ... [0 rule(s)] done [0.00s].
## creating S4 object \dots done [0.00s].
## set of 0 rules
# We see O Rules associated
plot(gm)
```

Scatter plot for 15 rules



plot(gm,method = "matrix")

```
## Itemsets in Antecedent (LHS)
    [1] "{citrus fruit,root vegetables}"
    [2] "{root vegetables, tropical fruit}"
##
    [3] "{root vegetables, yogurt}"
##
    [4] "{rolls/buns,root vegetables}"
##
##
    [5] "{curd,yogurt}"
    [6] "{butter,other vegetables}"
##
    [7] "{domestic eggs,other vegetables}"
    [8] "{whipped/sour cream, yogurt}"
##
       "{other vegetables,pip fruit}"
##
  [10] "{tropical fruit, yogurt}"
## [11] "{other vegetables,yogurt}"
## [12] "{other vegetables,whipped/sour cream}"
## Itemsets in Consequent (RHS)
## [1] "{whole milk}"
                             "{other vegetables}"
```

Matrix with 15 rules

