M4_L4_RomilShah

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Read Data and additional packages

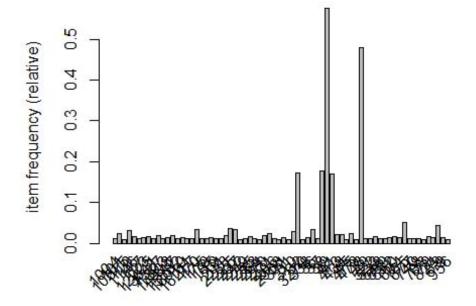
```
require(arules)
## Loading required package: arules
## Warning: package 'arules' was built under R version 3.2.5
## Loading required package: Matrix
## Warning: package 'Matrix' was built under R version 3.2.5
##
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
##
       abbreviate, write
require(arulesViz)
## Loading required package: arulesViz
## Warning: package 'arulesViz' was built under R version 3.2.5
## Loading required package: grid
require(Matrix)
urlData <- 'http://fimi.ua.ac.be/data/retail.dat'</pre>
retail <- read.transactions(url(urlData))</pre>
summary(retail)
## transactions as itemMatrix in sparse format with
## 88162 rows (elements/itemsets/transactions) and
## 16470 columns (items) and a density of 0.0006257289
##
## most frequent items:
##
        39
                48
                         38
                                 32
                                         41 (Other)
##
     50675
             42135
                     15596
                              15167
                                      14945 770058
##
## element (itemset/transaction) length distribution:
## sizes
                           5
                                                   10
##
      1
           2
                3
                                6
                                          8
                                                         11
                                                              12
                                                                   13
                                                                        14
                                                                             15
## 3016 5516 6919 7210 6814 6163 5746 5143 4660 4086 3751 3285 2866 2620 2310
```

```
22
                                                         25
##
     16
           17
                 18
                      19
                            20
                                  21
                                             23
                                                   24
                                                              26
                                                                    27
                                                                          28
                                                                               29
                                                                                     30
## 2115 1874 1645 1469 1290 1205
                                      981
                                            887
                                                  819
                                                        684
                                                             586
                                                                   582
                                                                        472
                                                                              480
                                                                                    355
##
     31
           32
                 33
                      34
                            35
                                  36
                                       37
                                             38
                                                   39
                                                        40
                                                              41
                                                                    42
                                                                          43
                                                                               44
                                                                                     45
##
    310
          303
                272
                     234
                           194
                                 136
                                      153
                                                                                     50
                                            123
                                                  115
                                                       112
                                                              76
                                                                    66
                                                                          71
                                                                               60
##
     46
           47
                 48
                      49
                            50
                                  51
                                       52
                                             53
                                                   54
                                                         55
                                                              56
                                                                    57
                                                                          58
                                                                               59
                                                                                     60
##
     44
           37
                 37
                      33
                            22
                                  24
                                        21
                                             21
                                                   10
                                                         11
                                                              10
                                                                     9
                                                                          11
                                                                                4
                                                                                      9
##
           62
                 63
                      64
                            65
                                  66
                                                   71
                                                         73
                                                              74
                                                                    76
     61
                                       67
                                             68
                  5
                             2
                                                         1
##
      7
            4
                       2
                                   5
                                        3
                                              3
                                                    1
                                                               1
                                                                     1
##
##
      Min. 1st Qu.
                      Median
                                  Mean 3rd Qu.
                                                    Max.
               4.00
                         8.00
##
      1.00
                                 10.31
                                          14.00
                                                   76.00
##
## includes extended item information - examples:
##
     labels
## 1
           0
           1
## 2
## 3
          10
# First few transactions
inspect(retail[1:20])
##
      items
## 1
      {0,
##
        1,
##
        10,
##
        11,
##
        12,
##
        13,
##
        14,
##
        15,
##
        16,
##
        17,
##
        18,
        19,
##
##
        2,
##
        20,
##
        21,
##
        22,
##
        23,
##
        24,
##
        25,
##
        26,
##
        27,
##
        28,
##
        29,
##
        3,
##
        4,
##
        5,
##
        6,
##
        7,
```

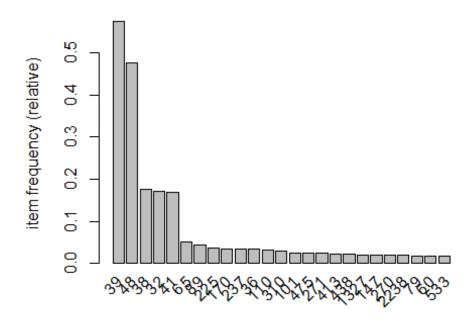
```
8,
##
##
        9}
## 2 {30,
##
       31,
##
        32}
## 3 {33,
##
        34,
##
        35}
## 4 {36,
##
        37,
##
        38,
##
        39,
##
        40,
##
        41,
##
       42,
##
        43,
       44,
##
       45,
##
##
        46}
      {38,
## 5
##
        39,
##
        47,
##
        48}
## 6
      {38,
##
        39,
##
       48,
       49,
##
       50,
##
##
        51,
##
        52,
##
       53,
##
        54,
##
        55,
##
        56,
##
        57,
       58}
##
## 7
      {32,
##
       41,
##
        59,
##
        60,
##
        61,
##
        62}
## 8
      {3,
       39,
##
       48}
##
## 9 {63,
##
        64,
##
        65,
##
        66,
##
       67,
```

```
## 68}
## 10 {32,
##
       69}
## 11 {48,
##
       70,
##
        71,
##
       72}
## 12 {39,
##
       73,
##
        74,
##
        75,
##
       76,
##
        77,
##
        78,
##
        79}
## 13 {36,
       38,
##
##
        39,
##
        41,
##
        48,
##
        79,
##
        80,
##
        81}
## 14 {82,
##
       83,
       84}
##
## 15 {41,
##
       85,
##
        86,
##
        87,
       88}
##
## 16 {100,
##
       101,
       39,
##
       48,
##
        89,
##
##
        90,
##
        91,
##
        92,
       93,
##
##
        94,
       95,
##
##
       96,
##
        97,
##
        98,
##
        99}
## 17 {36,
##
        38,
##
        39,
##
        48,
```

```
##
      89}
## 18 {102,
##
      103,
##
      104,
##
      105,
##
      106,
##
      107,
##
      108,
##
      39,
##
      41}
## 19 {109,
##
      110,
##
      38,
##
      39,
##
      41}
## 20 {111,
##
      112,
##
      113,
##
      114,
##
      115,
##
      116,
##
      117,
##
      118,
##
      39}
# Frequency of the data
itemFrequency(retail[1:100,1:20])
##
           1
               10
                    100 1000 10000 10001 10002 10003 10004 10005 10006
## 10007 10008 10009 1001 10010 10011 10012 10013
## 0.00 0.00 0.00 0.00 0.00 0.00 0.00
# Plotting the frequency
itemFrequencyPlot(retail, support=0.01)
```

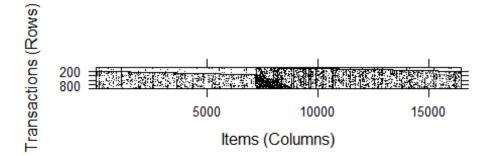


itemFrequencyPlot(retail,topN=25)

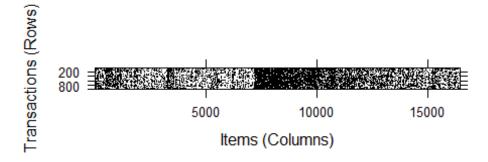


First 1000 transaction visualization
image(retail[1:1000])

Warning: closing unused connection 5
(http://fimi.ua.ac.be/data/retail.dat)



image(sample(retail,1000))



Generation of 50 or so non-redundant rules

```
rules1 <- apriori(retail)</pre>
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval originalSupport support minlen maxlen
##
           0.8
                  0.1
                         1 none FALSE
                                                 TRUE
                                                           0.1
                                                                    1
                                                                          10
## target
            ext
   rules FALSE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                    2
                                         TRUE
##
## Absolute minimum support count: 8816
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16470 item(s), 88162 transaction(s)] done [0.14s].
## sorting and recoding items ... [5 item(s)] done [0.01s].
## creating transaction tree ... done [0.03s].
## checking subsets of size 1 2 3 done [0.00s].
## writing ... [0 rule(s)] done [0.00s].
## creating S4 object ... done [0.01s].
rules1
## set of 0 rules
```

This gives set of 0 rules

```
rules2 <-
apriori(retail, parameter=list(support=0.01, confidence=0.52, minlen=2))
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval originalSupport support minlen maxlen
                         1 none FALSE
##
                                                 TRUE
                                                         0.01
                                                                          10
          0.52
                  0.1
                                                                   2
## target ext
##
   rules FALSE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                    2
                                         TRUE
##
## Absolute minimum support count: 881
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16470 item(s), 88162 transaction(s)] done [0.17s].
## sorting and recoding items ... [70 item(s)] done [0.01s].
```

```
## creating transaction tree ... done [0.04s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [107 rule(s)] done [0.00s].
## creating S4 object ... done [0.02s].
rules2
## set of 107 rules
summary(rules2)
## set of 107 rules
##
## rule length distribution (lhs + rhs):sizes
  2 3 4
## 51 41 15
##
##
                    Median
      Min. 1st Ou.
                              Mean 3rd Ou.
                                              Max.
##
     2.000
             2.000
                     3.000
                             2.664
                                     3.000
                                             4.000
##
## summary of quality measures:
##
       support
                        confidence
                                             lift
##
  Min.
           :0.01013
                      Min.
                             :0.5205
                                       Min.
                                               :0.9698
##
   1st Qu.:0.01263
                      1st Qu.:0.6146
                                       1st Qu.:1.1688
## Median :0.01588
                      Median :0.6848
                                       Median :1.2558
## Mean
           :0.03038
                      Mean
                             :0.7069
                                       Mean
                                               :1.8113
   3rd Ou.:0.02338
                      3rd Qu.:0.7642
                                        3rd Ou.:1.3833
## Max.
           :0.33055
                      Max.
                             :0.9942
                                              :5.6202
                                       Max.
##
## mining info:
##
      data ntransactions support confidence
                   88162 0.01
   retail
                                       0.52
```

This gives 107 rules

```
# Rules to dataframe conversion
inspect(rules2)
## lhs rhs support confidence lift
```

```
confidence lift
##
       1hs
                      rhs support
## 1
      {37}
                  => {38} 0.01186452 0.9739292 5.5054853
       {286}
## 2
                   => {38} 0.01265852 0.9433643 5.3327062
## 3
      {12925}
                   => {39} 0.01063950 0.6394001 1.1123985
## 4
      {1146}
                   => {39} 0.01114993 0.6893408 1.1992830
## 5
       {79}
                   => {48} 0.01012908 0.5581250
                                                1.1678039
                   => {39} 0.01260180 0.6943750
## 6
       {79}
                                                 1.2080412
## 7
       {1327}
                   => {48} 0.01097979 0.5419933
                                                1.1340504
## 8
       {1327}
                  => {39} 0.01311223 0.6472564 1.1260665
## 9
       {438}
                  => {48} 0.01162632 0.5501879
                                                 1.1511965
## 10
      {438}
                  => {39} 0.01429187 0.6763285
                                                 1.1766448
## 11
      {60}
                  => {39} 0.01114993 0.6601746 1.1485410
## 12
       {255}
                  => {48} 0.01198929 0.7170963
                                                1.5004307
## 13
      {255}
                  => {39} 0.01198929 0.7170963 1.2475707
```

```
## 14
       {533}
                    => {39} 0.01045802 0.6200403
                                                    1.0787173
## 15
       {270}
                    => {48} 0.01085502 0.5519031
                                                    1.1547854
       {270}
                    => {39} 0.01354325 0.6885813
                                                    1.1979616
## 16
## 17
       {2238}
                    => {48} 0.01083233 0.5568513
                                                    1.1651388
## 18
       {2238}
                    => {39} 0.01459813 0.7504373
                                                    1.3055758
## 19
                    => {38} 0.03090901 0.9753042
                                                    5.5132579
       {110}
## 20
       {110}
                    => {39} 0.01995191 0.6295634
                                                    1.0952849
##
   21
       {147}
                    => {48} 0.01175109 0.5823496
                                                    1.2184908
## 22
                    => {39} 0.01289671 0.6391231
                                                    1.1119165
       {147}
## 23
       {271}
                    => {48} 0.01236360 0.5205349
                                                    1.0891514
## 24
                    => {39} 0.01626551 0.6848138
                                                    1.1914070
       {271}
##
   25
       {413}
                    => {48} 0.01287403 0.6037234
                                                    1.2632126
##
   26
       {413}
                    => {39} 0.01281731 0.6010638
                                                    1.0457028
## 27
       {36}
                    => {38} 0.03164629 0.9502725
                                                    5.3717570
## 28
       {36}
                    => {39} 0.02310519 0.6938011
                                                    1.2070428
                    => {48} 0.01619745 0.6589755
  29
##
       {475}
                                                    1.3788205
##
   30
       {475}
                    => {39} 0.01701413 0.6922012
                                                    1.2042593
## 31
       {170}
                    => {38} 0.03437989 0.9780574
                                                    5.5288215
   32
       {170}
                                                    1.1559058
##
                    => {39} 0.02335473 0.6644079
## 33
                    => {48} 0.01487035 0.5860527
                                                    1.2262391
       {101}
##
   34
       {101}
                    => {39} 0.01587986 0.6258382
                                                    1.0888041
##
  35
                    => {48} 0.01919194 0.6522745
                                                    1.3647994
       {310}
## 36
                    => {39} 0.02100678 0.7139553
                                                    1.2421061
       {310}
## 37
       {237}
                    => {48} 0.01907851 0.5547493
                                                    1.1607407
                                                    1.1068549
## 38
                    => {39} 0.02188018 0.6362137
       {237}
##
   39
       {225}
                    => {48} 0.01969102 0.5330058
                                                    1.1152453
## 40
       {225}
                    => {39} 0.02666682 0.7218299
                                                    1.2558060
## 41
       {89}
                    => {48} 0.03173703 0.7292155
                                                    1.5257885
## 42
                    => {39} 0.03118123 0.7164451
       {89}
                                                    1.2464378
## 43
       {65}
                    => {48} 0.02868583 0.5655188
                                                    1.1832744
## 44
       {65}
                    => {39} 0.03161226 0.6232111
                                                    1.0842336
## 45
       {38}
                    => {39} 0.11734080 0.6633111
                                                    1.1539977
## 46
                    => {48} 0.09112770 0.5297026
       {32}
                                                    1.1083338
## 47
       {32}
                    => {39} 0.09590300 0.5574603
                                                    0.9698434
##
   48
       {41}
                    => {48} 0.10228897 0.6034125
                                                    1.2625621
##
   49
                    => {39} 0.12946621 0.7637337
       {41}
                                                    1.3287082
## 50
       {48}
                    => {39} 0.33055058 0.6916340
                                                    1.2032726
## 51
       {39}
                    => {48} 0.33055058 0.5750765
                                                    1.2032726
## 52
       {110,48}
                    => {38} 0.01543749 0.9862319
                                                    5.5750305
##
   53
       {110,38}
                    => {39} 0.01973639 0.6385321
                                                    1.1108884
## 54
                    => {38} 0.01973639 0.9891984
       {110,39}
                                                    5.5917998
## 55
       {110,48}
                    => {39} 0.01176244 0.7514493
                                                    1.3073364
## 56
       {110,39}
                    => {48} 0.01176244 0.5895395
                                                    1.2335346
##
   57
       {36,48}
                    => {38} 0.01542615 0.9604520
                                                    5.4293003
## 58
       {36,38}
                    => {39} 0.02206166 0.6971326
                                                    1.2128388
## 59
       {36,39}
                    => {38} 0.02206166 0.9548355
                                                    5.3975514
## 60
                    => {39} 0.01265852 0.7881356
       {36,48}
                                                    1.3711615
## 61
       {36,39}
                    => {48} 0.01265852 0.5478645
                                                    1.1463351
## 62
       {475,48}
                    => {39} 0.01238629 0.7647059
                                                    1.3303996
## 63
       {39,475}
                    => {48} 0.01238629 0.7280000
                                                    1.5232452
```

```
## 64
       {170,48}
                    => {38} 0.01744516 0.9877970
                                                    5.5838781
## 65
       {170,38}
                    => {39} 0.02290102 0.6661168
                                                    1.1588789
       {170,39}
                    => {38} 0.02290102 0.9805731
                                                    5.5430421
## 66
## 67
       {170,48}
                    => {39} 0.01367936 0.7745665
                                                    1.3475546
## 68
       {170,39}
                    => {48} 0.01367936 0.5857212
                                                    1.2255454
## 69
       {101,48}
                    => {39} 0.01073025 0.7215866
                                                    1.2553826
## 70
       {101,39}
                    => {48} 0.01073025 0.6757143
                                                    1.4138441
##
  71
       {310,48}
                    => {39} 0.01527869 0.7960993
                                                    1.3850164
## 72
       {310,39}
                    => {48} 0.01527869 0.7273218
                                                    1.5218262
## 73
       {237,48}
                    => {39} 0.01411039 0.7395957
                                                    1.2867141
## 74
       {237,39}
                    => {48} 0.01411039 0.6448937
                                                    1.3493561
## 75
       {225,48}
                    => {39} 0.01587986 0.8064516
                                                    1.4030269
##
   76
       {225,39}
                    => {48} 0.01587986 0.5954913
                                                    1.2459879
## 77
       {48,89}
                    => {39} 0.02410336 0.7594711
                                                    1.3212923
## 78
       {39,89}
                    => {48} 0.02410336 0.7730084
                                                    1.6174193
                    => {39} 0.02038293 0.7105575
## 79
       {48,65}
                                                    1.2361948
## 80
       {39,65}
                    => {48} 0.02038293 0.6447793
                                                    1.3491168
## 81
       {32,38}
                    => {48} 0.01867018 0.5810095
                                                    1.2156868
## 82
       {32,38}
                    => {39} 0.02087067 0.6494882
                                                    1.1299492
## 83
       {38,41}
                    => {48} 0.02692770 0.6091866
                                                    1.2746435
## 84
       {38,41}
                    => {39} 0.03460675 0.7829099
                                                    1.3620702
## 85
                    => {39} 0.06921349 0.7681269
       {38,48}
                                                    1.3363513
## 86
       {38,39}
                    => {48} 0.06921349 0.5898502
                                                    1.2341847
## 87
       {32,41}
                    => {48} 0.02340010 0.6454944
                                                    1.3506129
## 88
       {32,41}
                    => {39} 0.02675756 0.7381101
                                                    1.2841296
## 89
       {32,48}
                    => {39} 0.06127356 0.6723923
                                                    1.1697968
## 90
       {32,39}
                    => {48} 0.06127356 0.6389119
                                                    1.3368399
## 91
       {41,48}
                    => {39} 0.08355074 0.8168108
                                                    1.4210493
## 92
       {39,41}
                    => {48} 0.08355074 0.6453478
                                                    1.3503063
       \{110,38,48\} \Rightarrow \{39\} \ 0.01169438 \ 0.7575312
## 93
                                                    1.3179175
## 94
       \{110,38,39\} => \{48\} 0.01169438 0.5925287
                                                    1.2397892
## 95
       \{110,39,48\} \Rightarrow \{38\} \ 0.01169438 \ 0.9942141
                                                    5.6201527
## 96
       {36,38,48}
                    => {39} 0.01225018 0.7941176
                                                    1.3815688
## 97
       {36,38,39}
                    => {48} 0.01225018 0.5552699
                                                    1.1618300
## 98
       {36,39,48}
                    => {38} 0.01225018 0.9677419
                                                    5.4705094
## 99
       \{170,38,48\} \Rightarrow \{39\} \ 0.01353191 \ 0.7756827
                                                    1.3494966
## 100 {170,38,39} => {48} 0.01353191 0.5908866
                                                    1.2363532
## 101 {170,39,48} => {38} 0.01353191 0.9892206
                                                    5.5919251
## 102 {32,38,48}
                   => {39} 0.01401965 0.7509113
                                                    1.3064004
## 103 {32,38,39}
                    => {48} 0.01401965 0.6717391
                                                    1.4055266
## 104 {38,41,48}
                    => {39} 0.02258343 0.8386689
                                                    1.4590770
## 105 {38,39,41}
                    => {48} 0.02258343 0.6525729
                                                    1.3654239
## 106 {32,41,48}
                    => {39} 0.01867018 0.7978672
                                                    1.3880921
## 107 {32,39,41}
                   => {48} 0.01867018 0.6977533
                                                    1.4599579
rulesDF <- as(rules2, "data.frame")</pre>
str(rulesDF)
## 'data.frame':
                     107 obs. of 4 variables:
             : Factor w/ 107 levels "{101,39} => {48}",..: 74 47 16 15 105
```

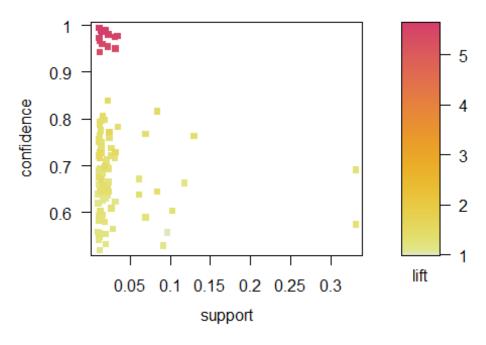
```
104 18 17 93 92 ...
                         0.0119 0.0127 0.0106 0.0111 0.0101 ...
    $ support
                 : num
                         0.974 0.943 0.639 0.689 0.558 ...
    $ confidence: num
##
    $ lift
                         5.51 5.33 1.11 1.2 1.17 ...
                 : num
# Removing redundant rules
subset.matrix <- is.subset(rules2,rules2)</pre>
subset.matrix[lower.tri(subset.matrix,diag = T)] <- NA</pre>
redundant <- colSums(subset.matrix,na.rm = T) >= 1
which(redundant)
##
                                                                        {110,39,48}
           {39,48}
                      {110,38,48}
                                       {110,38,39}
                                                       {110,38,39}
##
                51
                                52
                                                 53
                                                                 54
                                                                                  55
##
      {110,39,48}
                        {36,38,48}
                                                        {36,38,39}
                                                                         {36,39,48}
                                        {36,38,39}
##
                                57
                                                                 59
                56
                                                 58
                                                                                 60
##
       {36,39,48}
                       {39,475,48}
                                       {39,475,48}
                                                       {170,38,48}
                                                                        {170,38,39}
##
                                                                                 65
                61
                                62
                                                 63
                                                                 64
##
      {170,38,39}
                       {170,39,48}
                                       {170,39,48}
                                                        {101,39,48}
                                                                        {101,39,48}
##
                66
                                67
                                                 68
                                                                 69
                                                                                 70
##
      {310,39,48}
                       {310,39,48}
                                       {237,39,48}
                                                        {237,39,48}
                                                                        {225,39,48}
##
                71
                                72
                                                 73
                                                                 74
                                                                                 75
##
                        {39,48,89}
                                        {39,48,89}
      {225,39,48}
                                                         {39,48,65}
                                                                         {39,48,65}
##
                76
                                77
                                                                 79
                                                                                 80
                                                 78
##
       {32,38,48}
                        {32,38,39}
                                        {38,41,48}
                                                        {38,39,41}
                                                                         {38,39,48}
##
                                                                                 85
                81
                                82
                                                 83
                                                                 84
##
       {38,39,48}
                        {32,41,48}
                                        {32,39,41}
                                                         {32,39,48}
                                                                         {32,39,48}
##
                                                                 89
                                                                                 90
                86
                                87
                                                 88
##
       {39,41,48}
                        {39,41,48}
                                    {110,38,39,48}
                                                    {110,38,39,48} {110,38,39,48}
##
                91
                                92
                                                 93
                                                                 94
                                                                                 95
##
    {36,38,39,48}
                    {36,38,39,48}
                                     {36,38,39,48}
                                                    {170,38,39,48} {170,38,39,48}
##
                96
                                97
                                                 98
                                                                 99
                                                                                100
                                                     {38,39,41,48}
##
   {170,38,39,48}
                     {32,38,39,48}
                                     {32,38,39,48}
                                                                      {38,39,41,48}
##
               101
                               102
                                                103
                                                                104
                                                                                105
##
    {32,39,41,48}
                     {32,39,41,48}
##
               106
                               107
rulesPruned <- rules2[!redundant]
rulesPruned
## set of 50 rules
inspect(rulesPruned)
##
                                    confidence lift
      lhs
                  rhs
                        support
      {37}
               => {38} 0.01186452 0.9739292
## 1
                                                5.5054853
##
   2
      {286}
               => {38} 0.01265852 0.9433643
                                                5.3327062
## 3
      {12925} => {39} 0.01063950 0.6394001
                                                1.1123985
## 4
      {1146}
              => {39} 0.01114993 0.6893408
                                                1.1992830
## 5
               => {48} 0.01012908 0.5581250
      {79}
                                                1.1678039
##
   6
      {79}
               => {39} 0.01260180 0.6943750
                                                1.2080412
   7
      {1327}
               => {48} 0.01097979 0.5419933
                                                1.1340504
## 8
      {1327} => {39} 0.01311223 0.6472564
                                                1.1260665
```

```
## 9 {438}
              => {48} 0.01162632 0.5501879
                                              1.1511965
## 10 {438}
                 {39} 0.01429187 0.6763285
                                             1.1766448
## 11 {60}
              => {39} 0.01114993 0.6601746
                                              1.1485410
## 12 {255}
              => {48} 0.01198929 0.7170963
                                             1.5004307
## 13 {255}
              => {39} 0.01198929 0.7170963
                                              1.2475707
## 14 {533}
              => {39} 0.01045802 0.6200403
                                             1.0787173
## 15 {270}
              => {48} 0.01085502 0.5519031
                                              1.1547854
## 16 {270}
              => {39} 0.01354325 0.6885813
                                             1.1979616
## 17 {2238}
              => {48} 0.01083233 0.5568513
                                             1.1651388
              => {39} 0.01459813 0.7504373
## 18 {2238}
                                              1.3055758
## 19 {110}
              => {38} 0.03090901 0.9753042
                                              5.5132579
## 20 {110}
              => {39} 0.01995191 0.6295634
                                              1.0952849
## 21 {147}
              => {48} 0.01175109 0.5823496
                                             1.2184908
## 22 {147}
              => {39} 0.01289671 0.6391231
                                             1.1119165
## 23 {271}
              => {48} 0.01236360 0.5205349
                                             1.0891514
## 24 {271}
              => {39} 0.01626551 0.6848138
                                             1.1914070
## 25 {413}
              => {48} 0.01287403 0.6037234
                                             1.2632126
## 26 {413}
              => {39} 0.01281731 0.6010638
                                              1.0457028
## 27 {36}
              => {38} 0.03164629 0.9502725
                                              5.3717570
              => {39} 0.02310519 0.6938011
## 28 {36}
                                              1.2070428
## 29 {475}
              => {48} 0.01619745 0.6589755
                                              1.3788205
## 30 {475}
              => {39} 0.01701413 0.6922012
                                             1.2042593
## 31 {170}
              => {38} 0.03437989 0.9780574
                                              5.5288215
## 32 {170}
                                              1.1559058
              => {39} 0.02335473 0.6644079
## 33 {101}
              => {48} 0.01487035 0.5860527
                                              1.2262391
## 34 {101}
              => {39} 0.01587986 0.6258382
                                             1.0888041
## 35 {310}
              => {48} 0.01919194 0.6522745
                                             1.3647994
              => {39} 0.02100678 0.7139553
## 36 {310}
                                             1.2421061
## 37 {237}
              => {48} 0.01907851 0.5547493
                                              1.1607407
## 38 {237}
              => {39} 0.02188018 0.6362137
                                              1.1068549
## 39 {225}
              => {48} 0.01969102 0.5330058
                                             1.1152453
## 40 {225}
              => {39} 0.02666682 0.7218299
                                             1.2558060
## 41 {89}
              => {48} 0.03173703 0.7292155
                                             1.5257885
## 42 {89}
              => {39} 0.03118123 0.7164451
                                              1.2464378
## 43 {65}
              => {48} 0.02868583 0.5655188
                                             1.1832744
## 44 {65}
              => {39} 0.03161226 0.6232111
                                             1.0842336
## 45 {38}
              => {39} 0.11734080 0.6633111
                                             1.1539977
## 46 {32}
              => {48} 0.09112770 0.5297026
                                             1.1083338
## 47 {32}
              => {39} 0.09590300 0.5574603
                                             0.9698434
              => {48} 0.10228897 0.6034125
## 48 {41}
                                             1.2625621
## 49 {41}
              => {39} 0.12946621 0.7637337
                                             1.3287082
## 50 {48}
              => {39} 0.33055058 0.6916340
                                             1.2032726
```

Exactly 50 rules are obtained

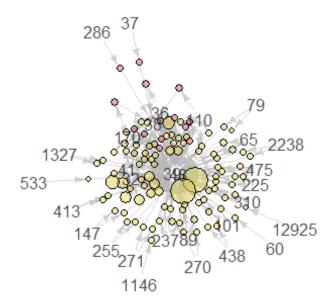
```
# Visualize association rules
plot(rules2)
```

Scatter plot for 107 rules



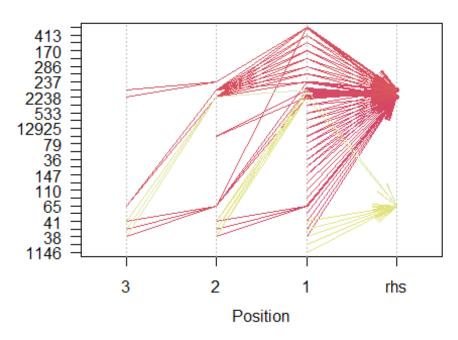
plot(rules2,method = "graph", control=list(type="items"))

Graph for 107 rules
size: support (0.01 - 0.331) color: lift (0.97 - 5.62)



plot(rules2, method="paracoord", control=list(reorder=TRUE))

Parallel coordinates plot for 107 rules



```
# Conviction
conviction <- interestMeasure(rulesPruned, "conviction", transactions=retail)</pre>
rulesConv<-as(rulesPruned, "data.frame")</pre>
rulesConv<-data.frame(rulesConv, conviction)</pre>
rulesConv
##
                 rules
                          support confidence
                                                    lift conviction
## 1
         {37} => {38} 0.01186452
                                    0.9739292 5.5054853
                                                          31.571702
## 2
        {286} => {38} 0.01265852
                                    0.9433643 5.3327062
                                                          14.533215
## 3
      {12925} => {39} 0.01063950
                                    0.6394001 1.1123985
                                                           1.179163
       {1146} => {39} 0.01114993
## 4
                                    0.6893408 1.1992830
                                                           1.368721
         {79} => {48} 0.01012908
## 5
                                    0.5581250 1.1678039
                                                           1.181495
## 6
         {79} => {39} 0.01260180
                                    0.6943750 1.2080412
                                                           1.391267
## 7
       {1327} => {48} 0.01097979
                                    0.5419933 1.1340504
                                                           1.139881
## 8
       {1327} => {39} 0.01311223
                                    0.6472564 1.1260665
                                                           1.205425
## 9
        {438} => {48} 0.01162632
                                    0.5501879 1.1511965
                                                           1.160647
## 10
        {438} => {39} 0.01429187
                                    0.6763285 1.1766448
                                                           1.313696
## 11
         \{60\} = \{39\} \ 0.01114993
                                    0.6601746 1.1485410
                                                           1.251248
## 12
        {255} => {48} 0.01198929
                                    0.7170963 1.5004307
                                                           1.845409
## 13
        {255} => {39} 0.01198929
                                    0.7170963 1.2475707
                                                           1.503006
        {533} => {39} 0.01045802
## 14
                                    0.6200403 1.0787173
                                                           1.119082
## 15
        \{270\} = \{48\} \ 0.01085502
                                    0.5519031 1.1547854
                                                           1.165090
## 16
                                    0.6885813 1.1979616
        {270} => {39} 0.01354325
                                                           1.365383
## 17
       \{2238\} \Rightarrow \{48\} \ 0.01083233
                                    0.5568513 1.1651388
                                                           1.178099
       {2238} => {39} 0.01459813
## 18
                                    0.7504373 1.3055758
                                                           1.703804
## 19
        {110} => {38} 0.03090901
                                    0.9753042 5.5132579
                                                          33.329520
        {110} => {39} 0.01995191 0.6295634 1.0952849
                                                           1.147850
```

```
## 21
        \{147\} \Rightarrow \{48\} \ 0.01175109
                                     0.5823496 1.2184908
                                                             1.250024
## 22
        {147} => {39} 0.01289671
                                     0.6391231 1.1119165
                                                             1.178257
## 23
        {271} => {48} 0.01236360
                                     0.5205349 1.0891514
                                                             1.088865
## 24
        {271} => {39} 0.01626551
                                     0.6848138 1.1914070
                                                             1.349062
                                                             1.317446
## 25
        {413} => {48} 0.01287403
                                     0.6037234 1.2632126
## 26
        {413} => {39} 0.01281731
                                     0.6010638 1.0457028
                                                             1.065849
## 27
         {36} => {38} 0.03164629
                                     0.9502725 5.3717570
                                                            16.552170
## 28
         {36} => {39} 0.02310519
                                     0.6938011 1.2070428
                                                             1.388659
## 29
        {475} => {48} 0.01619745
                                     0.6589755 1.3788205
                                                             1.530896
## 30
        {475} => {39} 0.01701413
                                     0.6922012 1.2042593
                                                             1.381441
## 31
        \{170\} = \{38\} \ 0.03437989
                                     0.9780574 5.5288215
                                                            37.511499
## 32
        \{170\} = \{39\} \ 0.02335473
                                     0.6644079 1.1559058
                                                             1.267032
## 33
        \{101\} => \{48\} 0.01487035
                                     0.5860527 1.2262391
                                                             1.261207
## 34
        \{101\} => \{39\} 0.01587986
                                     0.6258382 1.0888041
                                                             1.136422
## 35
        {310} \Rightarrow {48} 0.01919194
                                     0.6522745 1.3647994
                                                             1.501394
## 36
        {310} => {39} 0.02100678
                                     0.7139553 1.2421061
                                                             1.486501
## 37
        \{237\} = \{48\} \ 0.01907851
                                     0.5547493 1.1607407
                                                             1.172537
## 38
        {237} => {39} 0.02188018
                                     0.6362137 1.1068549
                                                             1.168834
## 39
        {225} => {48} 0.01969102
                                     0.5330058 1.1152453
                                                             1.117943
## 40
        {225} => {39} 0.02666682
                                     0.7218299 1.2558060
                                                             1.528582
## 41
         \{89\} => \{48\} \ 0.03173703
                                     0.7292155 1.5257885
                                                             1.928002
## 42
         {89} => {39} 0.03118123
                                     0.7164451 1.2464378
                                                             1.499554
## 43
         \{65\} => \{48\} \ 0.02868583
                                     0.5655188 1.1832744
                                                             1.201601
## 44
         {65} => {39} 0.03161226
                                     0.6232111 1.0842336
                                                             1.128499
## 45
         {38} => {39} 0.11734080
                                     0.6633111 1.1539977
                                                             1.262904
## 46
         {32} \Rightarrow {48} 0.09112770
                                     0.5297026 1.1083338
                                                             1.110091
## 47
         {32} => {39} 0.09590300
                                     0.5574603 0.9698434
                                                             0.960831
## 48
         \{41\} = \{48\} \ 0.10228897
                                     0.6034125 1.2625621
                                                             1.316413
## 49
         {41} => {39} 0.12946621
                                     0.7637337 1.3287082
                                                             1.799689
## 50
         {48} => {39} 0.33055058
                                    0.6916340 1.2032726
                                                             1.378900
```

Answers:

A(1)

The rules that have high level of confidence and high support makes proper sense to me. The top 5 Best rules based on high confidence and high support are:

```
1.\{48\} => \{39\}
```

 $2.\{41\} => \{39\}$

 $3.\{38\} => \{39\}$

 $4.\{41\} => \{48\}$

5. {32} => {39}

The top 5 Worst rules based on low confidence and low support are:

```
1.\{533\} \Rightarrow \{39\}
```

$$2.\{79\} => \{48\}$$

$$3.\{12925\} \Rightarrow \{39\}$$

$$4.\{2238\} \Rightarrow \{48\}$$

A(2)

Initially I used the default level of confidence and support but it yielded 0 results of rules. Thus I tried with a various permuation-conbination of 'support', 'confidence' and 'minlen'. Finally I was able to obtain about 107 rules with the following values: support = 0.01 confidence = 0.52 minlen = 2

The reason I obtained 107 rules is that most of the rules will be pruned as they might be redundant and hence I would have 50 rules in the end.

A(3)

Lift and conviction for top 5 Best rules: No....Rules.....Lift.......Conviction

- 1. $\{48\} \Rightarrow \{39\} \mid 1.2032726 \mid 1.378900$
- 2. {41} => {39} | 1.3287082 | 1.799689
- 3. $\{38\} \Rightarrow \{39\} \mid 1.1539977 \mid 1.262904$
- 4. $\{41\} \Rightarrow \{48\} \mid 1.2625621 \mid 1.316413$
- 5. {32} => {39} | 0.9698434 | 0.960831

Lift and conviction for top 5 Worst rules: No....Rules.....Lift......Conviction

- 1. $\{533\} \Rightarrow \{39\} \mid 1.0787173 \mid 1.119082$
- 2. {79} => {48} | 1.1678039 | 1.181495
- 3. {12925} => {39}| 1.1123985 | 1.179163
- 4. {2238} => {48} | 1.1651388 | 1.178099
- 5. {270} => {48} | 1.1547854 | 1.165090

A(4)

The best rules end up being in the centre of the visualization graph. Thus this proves that they are the best ones. The worst rules are on the outer end of the graph. Hence they do not contribute to the dataframe. It is clearly seen that the rules '48', '39', '41', '32' etc are quite close by. The rules '270', '2238', '12925' are far away from the centre and hence are the worst rules.

A(5)

Yes absolutely. The model makes good sense as the rules guide which path is to be taken in order to maximize the outputs. In terms of supermarket, if customers buy X and Y together as well as Y and Z together, then the rules guide them in such a way that whomsoever buys X or Y would end up buying Y at the least. This is where the rules help in maximizing the transactions and understanding the relations between each data item with respect to the other.