Homework 7

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Use the data about transactions in a supermarket. Run FIM and Association rule generation algorithms to identify interesting itemsets and rules.

DATA file - Attach:supermarket.txt

1. Report which tools you decided to use, how you used them, what were the first results. Also report the running times for the tools chosen.

```
library(arules)
library(arulesViz)
supermarketDF <- read.csv("C: /Users/Kenigbol o PC/Desktop/Data Mining/supermar</pre>
ket. txt", header = F, sep = " ")
supermarket <- read. transactions("C: /Users/Kenigbol o PC/Desktop/Data Mining/s</pre>
upermarket.txt", format = "basket", sep=" ")
print(system. time(supermarket <- read. transactions("C: /Users/Kenigbol o PC/Des</pre>
ktop/Data Mining/supermarket.txt", format = "basket", sep=" ")))
##
            system el apsed
      user
##
      3.91
              0.00
                       3.91
rules <- apriori (supermarket, parameter = list(minlen=2, supp=0.003, conf=0.8
), control = list(verbose=F))
inspect(rules)
##
      I hs
                                          support
                                                       confidence lift
                                  rhs
                               => {13973} 0.003348830 1.0000000
## 1
     {14438}
                                                                  12. 793347
## 2
                               => {5330} 0.003151840 0.9876543
     {7671}
                                                                   5.056200
## 3 {14381}
                               => {5330} 0.003348830 0.9139785
                                                                   4.679024
## 4
     {5695}
                               => {13973} 0.003821606 1.0000000
                                                                  12. 793347
## 5 {2740}
                               => {3423} 0.003309432 1.0000000
                                                                  16. 343851
## 6 {10814}
                               => {3423} 0.003191238 1.0000000
                                                                  16. 343851
## 7
      {12382}
                               => {5330}
                                          0.003939800 1.0000000
                                                                   5. 119403
## 8 {9326}
                               => {5330} 0.003545820 1.0000000
                                                                   5.119403
```

```
## 9 {14083}
                                  {5330}
                                          0.004254984 1.0000000
                                                                   5. 119403
## 10 {5422}
                                  {5330}
                                          0.003585218 0.9285714
                                                                   4.753731
## 11 {6174}
                                  {5330}
                                          0.004924750 1.0000000
                                                                   5. 119403
## 12 {3717}
                                  {5330}
                                          0.003664014 1.0000000
                                                                   5. 119403
## 13 {14744}
                               => {5330}
                                          0.004018596 1.0000000
                                                                   5. 119403
## 14 {12078}
                                  {5330}
                                          0.004294382 1.0000000
                                                                   5. 119403
## 15 {9630}
                                 {13973} 0.005200536 1.0000000
                                                                  12. 793347
## 16 {13491}
                                 {5330}
                                          0.005003546 1.0000000
                                                                   5. 119403
## 17 {233}
                               => {5330}
                                                                   5. 119403
                                          0.004688362 1.0000000
                                                                   4.906095
## 18 {8282}
                                  {5330}
                                          0.003624616 0.9583333
## 19 {5124}
                                 {13973} 0.004688362 0.8095238
                                                                  10. 356519
## 20 {7466}
                               => {5330}
                                          0.005870302 1.0000000
                                                                   5. 119403
##
  21 {2449}
                               => {5330}
                                          0.005239934 1.0000000
                                                                   5. 119403
## 22 {12456}
                               => {5330}
                                          0.007012844 1.0000000
                                                                   5. 119403
## 23 {14914}
                               => {5330}
                                          0. 011110236 0. 8924051
                                                                   4.568581
## 24 {12562}
                               => {5330}
                                          4. 440408
  25 {5330, 9630}
##
                               => {13973} 0.003151840 1.0000000
                                                                  12. 793347
  26 {13491, 14482}
                               => {5330}
                                          0.003388228 1.0000000
                                                                   5. 119403
  27 {13491, 9108}
##
                               => {5330}
                                          0.003348830 1.0000000
                                                                   5. 119403
  28 {14482, 14914}
                               => {5330}
                                          0.003900402 1.0000000
                                                                   5. 119403
  29 {14482, 14914}
                               => {9108}
                                          0.003348830 0.8585859
                                                                   3.912500
   30 {14754, 14914}
                               => {5330}
                                          0.003703412 0.9894737
                                                                   5.065515
##
## 31 {14914, 9108}
                               => {5330}
                                          0.006303680 0.9142857
                                                                   4.680597
##
  32 {14482, 6385}
                               => {14754} 0.005555118 0.8245614
                                                                  12. 638296
  33 {14482, 6385}
                               => {9108}
                                          3.810751
   34 {14482, 14754}
##
                               => {9108}
                                          0.006185486 0.8134715
                                                                   3.706918
## 35 {12562, 9108}
                                          0.004294382 0.8861789
                                                                   4.536707
                               => {5330}
  36 {11995, 9108}
                               => {5330}
                                          0.007091640 0.8737864
                                                                   4.473265
##
## 37 {14482, 14914, 5330}
                               => {9108}
                                          0.003348830 0.8585859
                                                                   3.912500
## 38 {14482, 14914, 9108}
                                          0.003348830 1.0000000
                                                                   5. 119403
                               => {5330}
## 39 {14482, 5330, 6385}
                               => {14754} 0.003939800 0.8064516
                                                                  12. 360722
## 40 {14754, 5330, 6385}
                               => {14482} 0.003939800 0.8333333
                                                                  54.939394
## 41 {14482, 14754, 6385}
                               => {9108}
                                          0.004648964 0.8368794
                                                                   3.813586
## 42 {14482, 6385, 9108}
                               => {14754} 0.004648964 0.8251748
                                                                  12. 647698
## 43 {14754, 6385, 9108}
                               => {14482} 0.004648964 0.8428571
                                                                  55. 567273
## 44 {14482, 5330, 6385}
                               => {9108}
                                          0.004136790 0.8467742
                                                                   3.858676
## 45 {14482, 14754, 5330}
                               => {9108}
                                          0.004570168 0.8226950
                                                                   3.748949
## 46 {14482, 14754, 5330, 6385} => {9108}
                                          0.003388228 0.8600000
                                                                   3.918944
## 47 {14482,5330,6385,9108} => {14754} 0.003388228 0.8190476
                                                                  12.553784
## 48 {14754, 5330, 6385, 9108}
                             => {14482} 0.003388228 0.9052632
                                                                  59. 681531
print(system.time(apriori(supermarket, parameter = list(minlen=2, supp=0.003,
conf=0.8), control = list(verbose=F))))
##
      user
            system el apsed
##
      0.14 0.00 0.14
```

Tools Used => I used the Arules and ArulezViz library in R

```
library(arules)
library(arulesViz)
```

How Tools were used => First I loaded the data into R by reading it in via "read.transactions" => Then I tried to inspect the taransactions by calling the "inspect()" method on the supermarket transaction values but there were so many of them => Later used the inspect to check the rules => Continuation of how tools were used can be seen in the first results and execution times sub sections

```
supermarket <- read.transactions("C:/Users/Kenigbolo PC/Desktop/Data Mining/s
upermarket.txt", format = "basket", sep=" ")</pre>
```

First results

The first results obtained are the following;

- => First I ran the apriori algorithm provided by the arules package and I used a support of 0.002 and this gave me about 120 rules which was obviously a whole lot
- => I ran the apriori algorithm a second time and increased the support to 0.003 and this produced 48 rules, which is what I settled for as this task as this was quite reasonable for this first task in my opinion albeit 0.002 should be more suitable for the next task.
- => I proceeded to do a scatter plot for the rules that plotted confidence against support using lift as the gauge
- => I also explored plotting a Graph for 48 rules which in my opinion wasn't really clear enough which made me to proceed by
- => Plotting parallel coordinates plot for the 48 rules. At this point I realized the graphs weren't really interepretable so I adjusted my support a bit.

```
rules <- apriori (supermarket, parameter = list(minlen=2, supp=0.002, conf=0.8
), control = list(verbose=F))
inspect(rules)
##
       I hs
                                    rhs
                                            support
                                                         confidence lift
## 1
                                 => {5330}
                                            0.002324482 1.0000000
                                                                      5. 119403
       {15427}
## 2
       {6614}
                                 => {7893}
                                            0.002245686 1.0000000
                                                                     13.742285
## 3
       {8016}
                                 => {13973} 0.002088094 1.0000000
                                                                     12. 793347
## 4
                                 => {5330} 0.002245686 1.0000000
       {1839}
                                                                      5. 119403
## 5
       {10006}
                                 => {13973} 0.002679064 1.0000000
                                                                     12.793347
                                            0.002048696 1.0000000
## 6
       {14105}
                                 => {3423}
                                                                     16. 343851
## 7
       {3269}
                                 => {3423}
                                            0.002521472 1.0000000
                                                                     16. 343851
## 8
       {5145}
                                 => {5330}
                                            0.002639666 1.0000000
                                                                      5. 119403
## 9
       {9290}
                                            0.002048696 1.0000000
                                 => {5330}
                                                                      5. 119403
## 10
       {6917}
                                 => {13973} 0.002285084 1.0000000
                                                                     12. 793347
## 11
       {15153}
                                            0.002285084 1.0000000
                                                                     19.405199
                                 => {3723}
## 12
       {8078}
                                 => {5330}
                                            0.002363880 1.0000000
                                                                      5. 119403
## 13
       {13903}
                                 => {5330}
                                            0.002639666 1.0000000
                                                                      5. 119403
## 14
       {6676}
                                 => {3723}
                                            0.002088094 1.0000000
                                                                     19. 405199
## 15
       {6651}
                                            0.002836656 1.0000000
                                                                     13.742285
                                 => {7893}
## 16
       {14474}
                                 => {3423}
                                             0.002954850 1.0000000
                                                                     16. 343851
## 17
       {14438}
                                 => {13973} 0.003348830 1.0000000
                                                                     12. 793347
```

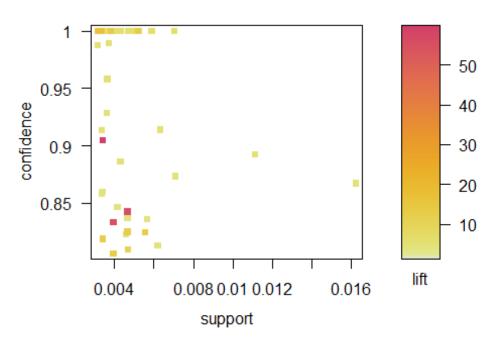
```
## 18
       {1508}
                                      {5330}
                                               0.002285084 1.0000000
                                                                         5. 119403
## 19
                                               0.002954850 1.0000000
       {3471}
                                      {5330}
                                                                         5. 119403
##
   20
       {7671}
                                      {5330}
                                               0.003151840 0.9876543
                                                                         5.056200
##
   21
       {14381}
                                   => {5330}
                                               0.003348830 0.9139785
                                                                         4.679024
  22
##
       {8971}
                                   => {3723}
                                               0.002876054 1.0000000
                                                                        19. 405199
##
   23
                                      {13973} 0.003821606 1.0000000
                                                                        12.793347
       {5695}
   24
##
       {2740}
                                     {3423}
                                               0.003309432 1.0000000
                                                                        16. 343851
   25
                                                                        16.343851
##
       {10814}
                                   => {3423}
                                               0.003191238 1.0000000
   26
##
                                   => {5330}
                                               0.002600268 1.0000000
       {10797}
                                                                         5. 119403
   27
##
       {14096}
                                      {5330}
                                               0.002363880 1.0000000
                                                                         5. 119403
##
   28
                                               0.003939800 1.0000000
       {12382}
                                   => {5330}
                                                                         5. 119403
##
   29
                                   => {5330}
                                               0.003545820 1.0000000
                                                                         5.119403
       {9326}
   30
                                               0.004254984 1.0000000
##
       {14083}
                                   => {5330}
                                                                         5. 119403
##
   31
       {5422}
                                   => {5330}
                                               0.003585218 0.9285714
                                                                         4. 753731
##
   32
       {6174}
                                      {5330}
                                               0.004924750 1.0000000
                                                                         5.119403
                                   =>
##
   33
       {3717}
                                   => {5330}
                                               0.003664014 1.0000000
                                                                         5. 119403
##
   34
       {14744}
                                   => {5330}
                                               0.004018596 1.0000000
                                                                         5. 119403
##
   35
                                               0.004294382 1.0000000
       {12078}
                                   => {5330}
                                                                         5. 119403
   36
                                   => {13973} 0.005200536 1.0000000
                                                                        12.793347
##
       {9630}
##
   37
       {13491}
                                   => {5330}
                                               0.005003546 1.0000000
                                                                         5. 119403
##
   38
       {233}
                                   => {5330}
                                               0.004688362 1.0000000
                                                                         5.119403
   39
                                               0.003624616 0.9583333
                                                                         4.906095
##
       {8282}
                                   => {5330}
##
  40
       {5124}
                                   => {13973} 0.004688362 0.8095238
                                                                        10.356519
##
  41
       {7466}
                                      {5330}
                                               0.005870302 1.0000000
                                                                         5. 119403
                                   =>
##
  42
                                               0.005239934 1.0000000
       {2449}
                                      {5330}
                                                                         5. 119403
##
  43
       {12456}
                                   => {5330}
                                               0.007012844 1.0000000
                                                                         5. 119403
##
   44
       {14914}
                                               0. 011110236 0. 8924051
                                                                         4.568581
                                   => {5330}
##
   45
                                               0. 016231975 0. 8673684
       {12562}
                                   => {5330}
                                                                         4.440408
##
   46
       {5695, 9108}
                                      {13973} 0.002127492 1.0000000
                                                                        12.793347
  47
       {5422, 9108}
                                               0.002088094 0.9814815
                                                                         5.024599
##
                                   => {5330}
##
   48
       {13973, 4435}
                                   => {5330}
                                               0.002088094 0.8281250
                                                                         4. 239506
##
   49
       {14744, 9108}
                                   => {5330}
                                               0.002363880 1.0000000
                                                                         5.119403
##
   50
       {5330, 9630}
                                      {13973} 0.003151840 1.0000000
                                                                        12.793347
                                   =>
##
   51
       {9108, 9630}
                                   => {13973} 0.002442676 1.0000000
                                                                        12. 793347
   52
       {13491, 6385}
                                   => {14482} 0.002245686 0.8507463
                                                                        56.087381
##
   53
##
       {13491, 14754}
                                  => {14482} 0.002482074 0.8289474
                                                                        54.650239
##
   54
       {13491, 14482}
                                   => {5330}
                                               0.003388228 1.0000000
                                                                         5. 119403
##
   55
       {13491, 14482}
                                   => {9108}
                                               0.002718462 0.8023256
                                                                         3.656127
##
   56
       {13491, 9108}
                                   => {14482} 0.002718462 0.8117647
                                                                        53. 517433
##
   57
       {13491, 6385}
                                  => {14754} 0.002206288 0.8358209
                                                                        12.810873
   58
##
       {13491, 6385}
                                   => {5330}
                                               0.002639666 1.0000000
                                                                         5. 119403
   59
       {13491, 14754}
                                               0.002994248 1.0000000
##
                                      {5330}
                                                                         5. 119403
                                   =>
##
   60
       {13491, 9108}
                                               0.003348830 1.0000000
                                                                         5. 119403
                                   => {5330}
##
   61
       {2556, 9108}
                                   => {5330}
                                               0.002088094 0.8688525
                                                                         4.448006
##
   62
       {11723, 9108}
                                   => {5330}
                                               0.002836656 0.8372093
                                                                         4. 286012
   63
                                   => {5330}
##
       {7466, 9108}
                                               0.002836656 1.0000000
                                                                         5. 119403
##
   64
       {2449, 8233}
                                   => {5330}
                                               0.002600268 1.0000000
                                                                         5.119403
##
   65
       {11217, 2449}
                                   => {5330}
                                               0.002482074 1.0000000
                                                                         5. 119403
##
   66
       {12456, 7595}
                                   => {5330}
                                               0.002521472 1.0000000
                                                                         5. 119403
## 67
       {12456, 9108}
                                   => {5330}
                                              0.002876054 1.0000000
                                                                         5. 119403
```

```
## 68
       {14914, 6385}
                                     {14482} 0.002206288 0.8358209
                                                                       55. 103392
##
   69
       {14482, 14914}
                                     {5330}
                                              0.003900402 1.0000000
                                                                        5. 119403
       {14482, 14914}
##
   70
                                     {9108}
                                              0.003348830 0.8585859
                                                                        3.912500
##
   71
       {14914, 6385}
                                  => {5330}
                                              0.002639666 1.0000000
                                                                        5. 119403
   72
##
       {14914, 6385}
                                  =>
                                     {9108}
                                              0.002245686 0.8507463
                                                                        3.876776
##
   73
                                              0.003703412 0.9894737
       {14754, 14914}
                                     {5330}
                                                                        5.065515
##
   74
       {13973, 14914}
                                     {5330}
                                              0.002954850 0.9868421
                                                                        5.052042
   75
       {14914, 9108}
##
                                  => {5330}
                                              0. 006303680 0. 9142857
                                                                        4. 680597
   76
##
       {14482, 6385}
                                  => {14754} 0.005555118 0.8245614
                                                                       12. 638296
##
   77
       {14482, 6385}
                                     {9108}
                                              3.810751
##
   78
       {14482, 14754}
                                     {9108}
                                              0. 006185486 0. 8134715
                                                                        3.706918
##
   79
       {12562, 14754}
                                              0.002245686 0.8769231
                                                                        4.489323
                                  => {5330}
   80
##
       {12562, 13973}
                                  => {5330}
                                              0.002679064 0.9315068
                                                                        4.768759
       {11217, 12562}
##
   81
                                  => {5330}
                                              0.002757860 0.8433735
                                                                        4. 317569
##
   82
       {12562, 9108}
                                     {5330}
                                              0.004294382 0.8861789
                                                                        4.536707
                                  =>
   83
##
       {11026, 15463}
                                  => {7595}
                                              14. 619035
##
   84
       {11995, 3423}
                                  => {5330}
                                              4. 225539
   85
##
       {11995, 9108}
                                  => {5330}
                                              0.007091640 0.8737864
                                                                        4.473265
   86
       {13491, 14482, 6385}
##
                                     {5330}
                                              0.002245686 1.0000000
                                                                        5. 119403
                                  =>
##
   87
       {13491, 5330, 6385}
                                  => {14482} 0.002245686 0.8507463
                                                                       56.087381
##
  88
       {13491, 14482, 14754}
                                  => {5330}
                                              0.002482074 1.0000000
                                                                        5.119403
   89
                                  => {14482} 0.002482074 0.8289474
##
       {13491, 14754, 5330}
                                                                       54.650239
##
   90
       {13491, 14482, 5330}
                                  => {9108}
                                              0.002718462 0.8023256
                                                                        3.656127
##
   91
       {13491, 14482, 9108}
                                     {5330}
                                              0.002718462 1.0000000
                                                                        5. 119403
                                  =>
##
   92
                                     {14482} 0.002718462 0.8117647
       {13491, 5330, 9108}
                                                                       53. 517433
##
   93
       {13491, 14754, 6385}
                                     {5330}
                                              0.002206288 1.0000000
                                                                        5. 119403
   94
##
       {13491, 5330, 6385}
                                  => {14754} 0.002206288 0.8358209
                                                                       12.810873
   95
                                              0.002009298 1.0000000
##
       {13491, 6385, 9108}
                                  => {5330}
                                                                        5. 119403
##
   96
       {13491, 14754, 9108}
                                     {5330}
                                              0.002088094 1.0000000
                                                                        5. 119403
                                              0.002206288 1.0000000
##
   97
       {14482, 14914, 6385}
                                  => {5330}
                                                                        5. 119403
   98
       {14914, 5330, 6385}
                                  => {14482} 0.002206288 0.8358209
                                                                       55. 103392
##
##
       {14482, 14754, 14914}
                                  => {5330}
                                              0.002876054 1.0000000
                                                                        5. 119403
##
   100 {14482, 14754, 14914}
                                     {9108}
                                              0.002442676 0.8493151
                                                                        3.870254
                                  =>
   101 {14754, 14914, 9108}
                                     {14482} 0.002442676 0.8493151
                                                                       55. 993026
   102 {14482, 14914, 5330}
                                              0.003348830 0.8585859
##
                                     {9108}
                                                                        3. 912500
   103 {14482, 14914, 9108}
                                  => {5330}
                                              0.003348830 1.0000000
                                                                        5. 119403
  104 {14754, 14914, 6385}
                                  => {5330}
                                              0.002088094 1.0000000
                                                                        5. 119403
## 105 {14914, 5330, 6385}
                                     {9108}
                                              0.002245686 0.8507463
                                                                        3.876776
                                  =>
                                              0.002245686 1.0000000
                                                                        5. 119403
   106 {14914, 6385, 9108}
                                  => {5330}
   107 {14754, 14914, 9108}
                                  => {5330}
                                              0.002876054 1.0000000
                                                                        5. 119403
##
  108 {14482, 5330, 6385}
                                  => {14754} 0.003939800 0.8064516
                                                                       12.360722
   109 {14754, 5330, 6385}
                                     {14482} 0.003939800 0.8333333
                                                                       54. 939394
                                  =>
                                  => {9108}
                                              0.004648964 0.8368794
   110 {14482, 14754, 6385}
                                                                        3.813586
  111 {14482, 6385, 9108}
                                  => {14754} 0.004648964 0.8251748
                                                                       12.647698
##
## 112 {14754, 6385, 9108}
                                  => {14482} 0.004648964 0.8428571
                                                                       55. 567273
  113 {14482, 5330, 6385}
                                  => {9108}
                                              0. 004136790 0. 8467742
                                                                        3.858676
## 114 {14482, 14754, 5330}
                                  => {9108}
                                              0.004570168 0.8226950
                                                                        3.748949
  115 {14482, 14754, 14914, 5330} => {9108}
                                              0.002442676 0.8493151
                                                                        3.870254
## 116 {14482, 14754, 14914, 9108} => {5330}
                                              0.002442676 1.0000000
                                                                        5. 119403
## 117 {14754, 14914, 5330, 9108} => {14482} 0.002442676 0.8493151
                                                                       55. 993026
```

```
## 118 {14482, 14754, 5330, 6385} => {9108} 0.003388228 0.8600000
                                                                                                  3. 918944
## 119 {14482, 5330, 6385, 9108}
                                              => {14754} 0.003388228 0.8190476
                                                                                                12. 553784
## 120 {14754, 5330, 6385, 9108}
                                             => {14482} 0.003388228 0.9052632
                                                                                                 59. 681531
rules <- apriori (supermarket, parameter = list(minlen=2, supp=0.003, conf=0.8
), control = list(verbose=F))
inspect(rules)
##
                                                            support
         I hs
                                                                              confidence lift
                                                 rhs
## 1
        {14438}
                                            => {13973} 0.003348830 1.0000000
                                                                                              12. 793347
                                          => {5330}  0.003151840  0.9876543
## 2
        {7671}
                                                                                                5.056200
## 3
        {14381}
                                                            0.003348830 0.9139785
                                                                                                4.679024
                                          => {5330}
                         => {13973} 0.003821606 1.0000000
=> {3423} 0.003309432 1.0000000
=> {3423} 0.003191238 1.0000000
=> {5330} 0.003939800 1.0000000
=> {5330} 0.003545820 1.0000000
=> {5330} 0.004254984 1.0000000
=> {5330} 0.003585218 0.9285714
=> {5330} 0.004924750 1.0000000
=> {5330} 0.004924750 1.0000000
=> {5330} 0.004018596 1.0000000
=> {5330} 0.004294382 1.0000000
=> {5330} 0.004294382 1.0000000
=> {5330} 0.005200536 1.0000000
=> {5330} 0.005200536 1.0000000
=> {5330} 0.004688362 1.0000000
=> {5330} 0.004688362 1.0000000
=> {5330} 0.004688362 0.8095238
=> {5330} 0.005870302 1.0000000
=> {5330} 0.005870302 1.0000000
=> {5330} 0.005239934 1.0000000
=> {5330} 0.005239934 1.0000000
=> {5330} 0.007012844 1.0000000
=> {5330} 0.007012844 1.0000000
=> {5330} 0.011110236 0.8924051
=> {5330} 0.016231975 0.8673684
## 4
        {5695}
                                          => {13973} 0.003821606 1.0000000
                                                                                              12. 793347
## 5
        {2740}
                                                                                              16.343851
## 6
        {10814}
                                                                                              16. 343851
                                                                                               5. 119403
## 7
         {12382}
## 8
        {9326}
                                                                                                5. 119403
                                                                                                5.119403
## 9 {14083}
## 10 {5422}
                                                                                                4.753731
## 11 {6174}
                                                                                                5.119403
## 12 {3717}
                                                                                                5. 119403
## 13 {14744}
                                                                                                5. 119403
## 14 {12078}
                                                                                               5. 119403
## 15 {9630}
                                                                                              12. 793347
## 16 {13491}
                                                                                               5. 119403
## 17 {233}
                                                                                                5. 119403
## 18 {8282}
                                                                                                4.906095
## 19 {5124}
                                                                                              10. 356519
## 20 {7466}
                                                                                                5. 119403
## 21 {2449}
                                                                                                5. 119403
## 22 {12456}
                                                                                                5. 119403
## 23 {14914}
                                                                                                4. 568581
## 24 {12562}
                                         => {5330}
                                                            4.440408
                                       => {13973} 0.003151840 1.0000000
=> {5330} 0.003388228 1.0000000
## 25 {5330, 9630}
                                                                                              12. 793347
## 26 {13491, 14482}
                                                                                               5. 119403
## 27 {13491, 9108}
                                          => {5330}
                                                            0.003348830 1.0000000
                                                                                                5. 119403
## 28 {14482, 14914}
                                          => {5330}
                                                            0.003900402 1.0000000
                                                                                                5.119403
## 29 {14482, 14914}
                                           => {9108}
                                                            0.003348830 0.8585859
                                                                                                3. 912500
## 30 {14754, 14914}
                                          => {5330}
                                                            0.003703412 0.9894737
                                                                                                5.065515
                                         => {5330} 0.006303680 0.9142857
=> {14754} 0.005555118 0.8245614
## 31 {14914, 9108}
                                                                                                4.680597
## 32 {14482,6385}
                                                                                              12. 638296
## 33 {14482, 6385}
                                          => {9108}
                                                                                                3.810751
                                                            0. 005633914 0. 8362573
## 34 {14482, 14754}
                                          => {9108}
                                                            0.006185486 0.8134715
                                                                                                3.706918
## 35 {12562, 9108}
                                          => {5330}
                                                            0.004294382 0.8861789
                                                                                                4. 536707
## 36 {11995, 9108}
                                          => {5330}
                                                            0.007091640 0.8737864
                                                                                                4.473265
## 37 {14482, 14914, 5330}
                                           => {9108}
                                                            0.003348830 0.8585859
                                                                                                3.912500
## 38 {14482, 14914, 9108}
                                           => {5330}
                                                            0.003348830 1.0000000
                                                                                                5. 119403
                                     => {14754} 0.003939800 0.8064516
=> {14482} 0.003939800 0.8333333
=> {9108} 0.004648964 0.8368794
## 39 {14482, 5330, 6385}
                                                                                              12. 360722
## 40 {14754, 5330, 6385}
                                                                                              54. 939394
## 41 {14482, 14754, 6385}
                                                                                               3.813586
```

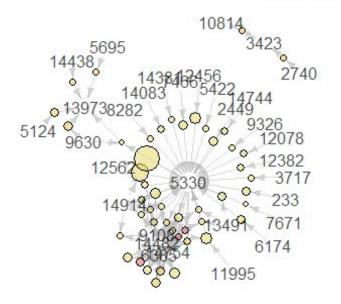
```
## 42 {14482, 6385, 9108}
                               => {14754} 0.004648964 0.8251748
                                                                   12.647698
## 43 {14754, 6385, 9108}
                               => {14482} 0.004648964 0.8428571
                                                                   55. 567273
## 44 {14482, 5330, 6385}
                               => {9108} 0.004136790 0.8467742
                                                                    3.858676
## 45 {14482, 14754, 5330}
                               => {9108}
                                           0.004570168 0.8226950
                                                                    3.748949
## 46 {14482, 14754, 5330, 6385} => {9108}
                                           0.003388228 0.8600000
                                                                    3. 918944
## 47 {14482, 5330, 6385, 9108} => {14754} 0.003388228 0.8190476
                                                                   12.553784
## 48 {14754, 5330, 6385, 9108} => {14482} 0. 003388228 0. 9052632
                                                                   59.681531
plot(rules)
```

Scatter plot for 48 rules



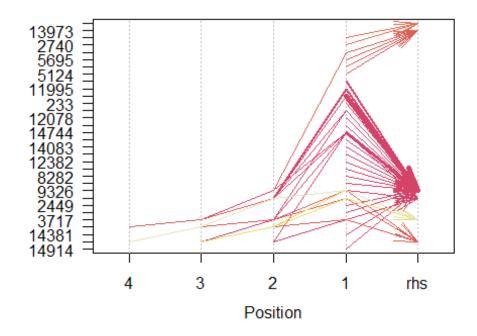
plot(rules, method="graph", control=list(type="items"))

Graph for 48 rules size: support (0.003 - 0.016) color: lift (3.707 - 59.682)



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

Parallel coordinates plot for 48 rules



=> I increased support to 0.004 in order to get a clearer picture and plots that are a bit understandable and this reduced my rules further to 24

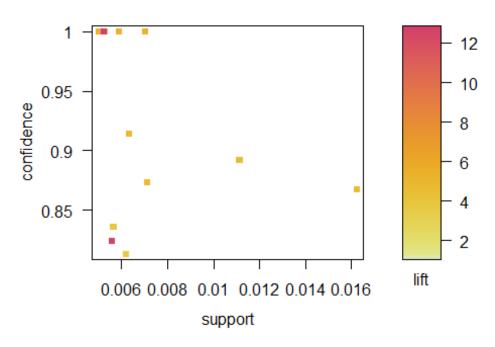
```
rules <- apriori(supermarket, parameter = list(minlen=2, supp=0.004, conf=0.8
), control = list(verbose=F))
inspect(rules)
##
      Ihs
                            rhs
                                     support
                                                 confidence lift
## 1
      {14083}
                                    0.004254984 1.0000000
                         => {5330}
                                                             5.119403
## 2
      {6174}
                         => {5330}
                                    0.004924750 1.0000000
                                                             5.119403
## 3
     {14744}
                         => {5330}
                                    0.004018596 1.0000000
                                                             5. 119403
## 4
     {12078}
                         => {5330}
                                    0.004294382 1.0000000
                                                             5. 119403
## 5
     {9630}
                         => {13973} 0.005200536 1.0000000
                                                            12. 793347
## 6
     {13491}
                         => {5330}
                                    0.005003546 1.0000000
                                                             5. 119403
## 7
      {233}
                         => {5330}
                                     0.004688362 1.0000000
                                                             5.119403
## 8
     {5124}
                         => {13973} 0.004688362 0.8095238
                                                            10. 356519
                         => {5330} 0.005870302 1.0000000
## 9 {7466}
                                                             5. 119403
## 10 {2449}
                         => {5330}
                                    0.005239934 1.0000000
                                                             5.119403
## 11 {12456}
                         => {5330} 0.007012844 1.0000000
                                                             5.119403
## 12 {14914}
                                    0. 011110236 0. 8924051
                         => {5330}
                                                             4. 568581
## 13 {12562}
                         => {5330}
                                    0. 016231975  0. 8673684
                                                             4.440408
## 14 {14914, 9108}
                         => {5330}
                                     0.006303680 0.9142857
                                                             4.680597
## 15 {14482, 6385}
                         => {14754} 0.005555118 0.8245614
                                                            12.638296
## 16 {14482, 6385}
                         => {9108} 0.005633914 0.8362573
                                                             3.810751
## 17 {14482, 14754}
                         => {9108} 0.006185486 0.8134715
                                                             3.706918
## 18 {12562, 9108}
                         => {5330}
                                    0.004294382 0.8861789
                                                             4.536707
## 19 {11995, 9108}
                         => {5330}
                                    0.007091640 0.8737864
                                                             4.473265
## 20 {14482, 14754, 6385} => {9108}
                                     0.004648964 0.8368794
                                                             3.813586
## 21 {14482,6385,9108} => {14754} 0.004648964 0.8251748
                                                            12.647698
## 22 {14754, 6385, 9108}
                         => {14482} 0.004648964 0.8428571
                                                            55. 567273
                         => {9108}
## 23 {14482, 5330, 6385}
                                     0.004136790 0.8467742
                                                             3.858676
## 24 {14482, 14754, 5330} => {9108}
                                    0.004570168 0.8226950
                                                             3.748949
```

=> I further increased support to 0.005 in order to to see what the rule distribution will be like and I got 12 rules. => At this point it made sense to make plots again which I did by making a scatter plot and I noticed that majority of the rules had thier support between 0.006 and 0.008 and lift was high when support was <= 0.006 => I plotted the graph for 12 rules and the distribution gave me a clear view of the most frequent items => The parallel coordiates plot gave an interesting insight for 14482 as the arrow had a dissimilar direction wen compared to the other items

```
rules <- apriori(supermarket, parameter = list(minlen=2, supp=0.005, conf=0.8
), control = list(verbose=F))
inspect(rules)
##
      Ihs
                               support
                                            confidence lift
                       rhs
      {9630}
## 1
                    => {13973} 0.005200536 1.0000000
                                                      12. 793347
## 2
      {13491}
                    => {5330}
                               0.005003546 1.0000000
                                                        5. 119403
## 3
                               0.005870302 1.0000000
     {7466}
                    => {5330}
                                                        5. 119403
## 4
     {2449}
                    => {5330} 0.005239934 1.0000000
                                                        5. 119403
```

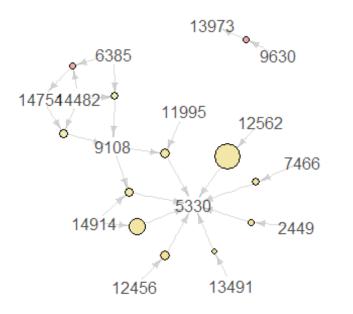
```
=> {5330}
                                0.007012844 1.0000000
## 5
      {12456}
                                                         5.119403
## 6
     {14914}
                    => {5330}
                                0. 011110236 0. 8924051
                                                         4.568581
## 7
      {12562}
                    => {5330}
                                0.016231975 0.8673684
                                                         4.440408
## 8
     {14914, 9108}
                    => {5330}
                                0.006303680 0.9142857
                                                         4.680597
## 9 {14482, 6385}
                    => {14754} 0.005555118 0.8245614
                                                        12.638296
## 10 {14482, 6385}
                    => {9108}
                                0.005633914 0.8362573
                                                         3.810751
## 11 {14482, 14754} => {9108}
                                0.006185486 0.8134715
                                                         3.706918
## 12 {11995, 9108} => {5330}
                                0.007091640 0.8737864
                                                         4.473265
plot(rules)
```

Scatter plot for 12 rules



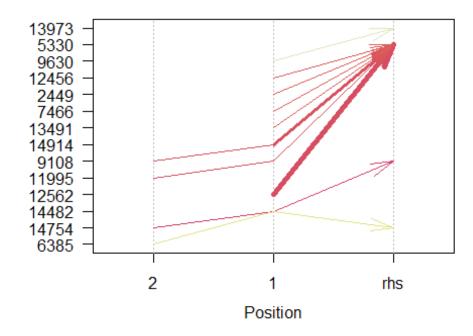
plot(rules, method="graph", control=list(type="items"))

Graph for 12 rules size: support (0.005 - 0.016) color: lift (3.707 - 12.793)



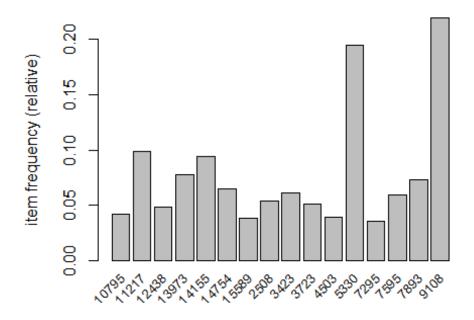
plot(rules, method="paracoord", control=list(reorder=TRUE))

Parallel coordinates plot for 12 rules



=> Finally I decided to do a frequency plot for all items with a support of at least 0.035 in the data in order to enable me to compare about 15 items and identify which of those items had quite high frequency

```
itemFrequencyPlot(supermarket, support = 0.035, cex.names=0.8)
```



Running time for chosen tool \Rightarrow The running time of reading in the data itself is as follows user system elapsed 4.86 0.00 4.86

```
print(system.time(supermarket <- read.transactions("C:/Users/Kenigbolo PC/Des
ktop/Data Mining/supermarket.txt", format = "basket", sep=" ")))
## user system elapsed
## 4.37 0.02 4.44</pre>
```

=> The running time for the rules is as follows user system elapsed 0.16 0.00 0.16

```
print(system.time(apriori(supermarket, parameter = list(minlen=2, supp=0.003, conf=0.8), control = list(verbose=F))))
## user system elapsed
## 0.19 0.00 0.19
```

2. Report overall 5 different high-support, high-confidence, high-lift rules; provide the respective contingency tables and scores.

High Support - Top 5

```
## Mine frequent rules with top support
top. support <- sort(rules, decreasing = TRUE, na.last = NA, by = "support")
## Display the 10 rules with the highest support.
inspect(head(top.support, 5))
##
      I hs
                      rhs
                             support
                                         confidence lift
## 7
     {12562}
                  => {5330} 0.016231975 0.8673684 4.440408
## 6 {14914}
                  => {5330} 0.011110236 0.8924051
                                                    4.568581
## 12 {11995, 9108} => {5330} 0.007091640 0.8737864 4.473265
## 5 {12456}
                 => {5330} 0.007012844 1.0000000 5.119403
## 8 {14914, 9108} => {5330} 0.006303680 0.9142857 4.680597
```

High Confidence - Top 10

```
## Mine frequent rules with top confidence.
top. confidence <- sort(rules, decreasing = TRUE, na.last = NA, by = "confiden
ce")
## Display the 10 itemsets with the highest confidence.
inspect(head(top.confidence, 5))
##
    Ihs
                                 confidence lift
               rhs
                      support
## 1 {9630} => {13973} 0.005200536 1
                                            12.793347
5. 119403
## 3 {7466} => {5330} 0.005870302 1
                                             5. 119403
## 4 {2449} => {5330} 0.005239934 1
                                             5. 119403
## 5 {12456} => {5330} 0.007012844 1
                                             5. 119403
```

High Lift - Top 10

```
## Mine frequent rules with top lift.
top.lift <- sort(rules, decreasing = TRUE, na.last = NA, by = "lift")
## Display the 10 itemsets with the highest lift.
inspect(head(top.lift, 5))
##
     I hs
                     rhs
                             support
                                         confidence lift
## 1 {9630}
                  => {13973} 0.005200536 1.0000000 12.793347
## 9 {14482, 6385} => {14754} 0.005555118 0.8245614 12.638296
## 2 {13491}
                  => {5330} 0.005003546 1.0000000
                                                     5. 119403
## 3 {7466}
                  => {5330} 0.005870302 1.0000000
                                                     5. 119403
## 4 {2449}
                  => {5330} 0.005239934 1.0000000
                                                     5. 119403
```

The respective contingency tables

```
## 2
      {13491}
                     => {5330}
                                 0.005003546 1.0000000
                                                          5.119403
## 3
                                                          5.119403
      {7466}
                     => {5330}
                                 0.005870302 1.0000000
## 4
      {2449}
                     => {5330}
                                 0.005239934 1.0000000
                                                          5.119403
## 5
     {12456}
                     => {5330}
                                 0.007012844 1.0000000
                                                          5. 119403
## 6
     {14914}
                     => {5330}
                                 0. 011110236 0. 8924051
                                                          4.568581
## 7
      {12562}
                     => {5330}
                                 0.016231975 0.8673684
                                                          4.440408
      {14914, 9108}
## 8
                     => {5330}
                                 0.006303680 0.9142857
                                                          4.680597
## 9
      {14482, 6385}
                     => {14754} 0.005555118 0.8245614
                                                         12.638296
## 10 {14482,6385}
                     => {9108}
                                 0.005633914 0.8362573
                                                          3.810751
## 11 {14482, 14754} => {9108}
                                 0.006185486 0.8134715
                                                          3.706918
## 12 {11995, 9108}
                    => {5330}
                                0.007091640 0.8737864
                                                          4.473265
#Outline Rules for contingency table
pri nt(cont_table)
##
                 Ihs
                                     support confidence
                                                              lift
                            rhs
## 1
              \{9630\} = \{13973\} \ 0.005200536
                                              1.0000000 12.793347
## 2
            {13491} =>
                         {5330} 0.005003546
                                              1.0000000
                                                          5. 119403
## 3
             {7466} =>
                         {5330} 0.005870302
                                              1.0000000
                                                          5. 119403
## 4
             {2449} =>
                         {5330} 0.005239934
                                              1.0000000
                                                          5.119403
## 5
            {12456} =>
                                              1.0000000
                         {5330} 0.007012844
                                                          5. 119403
## 6
            {14914} =>
                         {5330} 0.011110236
                                              0.8924051
                                                          4.568581
## 7
            {12562} =>
                         {5330} 0.016231975
                                              0.8673684
                                                          4.440408
## 8
       {14914, 9108} =>
                         {5330} 0.006303680
                                              0. 9142857
                                                          4. 680597
## 9
       \{14482, 6385\} => \{14754\} \ 0.005555118
                                              0.8245614 12.638296
## 10
      {14482, 6385} =>
                         {9108} 0.005633914
                                              0.8362573
                                                          3.810751
## 11 {14482, 14754} =>
                         {9108} 0.006185486
                                              0.8134715
                                                          3.706918
## 12 {11995, 9108} =>
                         {5330} 0.007091640
                                              0.8737864
                                                          4.473265
library(dplyr)
```

Contingency Tables

From filtering, the data the following values will be sieved out F11 (intersect of A and B in the DF), F1+(frequency of item A in the DF), F+1 (Frequency of item B in the DF) and TOTAL (total number of transactions i.e. observables in the DF). The rest values will to be calculated will be done as stated below

```
F10 = F1 + - F11
F01 = F+1 - F11
F0+ = TOTAL - F1+
F+0 = TOTAL - F+1
F00 = F+0 - F10
RULE 9630 => 13973
\#Filter the Rules Dataframe for where the item 9630 is present subset 9630 <- filter(supermarket DF, V1 == "9630" | V2 == "9630" | V3 == "9630" | V4 == "9630"
```

```
" |V4 == "9630" |V5 == "9630" |V6 == "9630" |V7 == "9630" |V8 == "9630" |V9 =
= "9630" | V10 == "9630" | V11 == "9630" )
#Total number of observables where
nrow(subset9630)
## [1] 132
#Filter the rules dataframe for where the item 13973 is present
subset13973 <- filter(supermarketDF, V1 == "13973" | V2 == "13973" | V3 == "1
3973" | V4 == "13973" | V5 == "13973" | V6 == "13973" | V7 == "13973" | V8 == "139
73" | V9 == "13973" | V10 == "13973" | V11 == "13973" |
#Total number of observables where
nrow(subset13973)
## [1] 1984
#filter for where both 9630 and 13973 exists
subset9630_13973 <- filter(subset9630, V1 == "13973" | V2 == "13973" | V3 ==
"13973" |V4 == "13973" |V5 == "13973" |V6 == "13973" |V7 == "13973" |V8 == "1
3973" | V9 == "13973" | V10 == "13973" | V11 == "13973" )
#Total number of observables where both 9630 and 13973
nrow(subset9630_13973)
## [1] 95
#Total number in Data Frame
nrow(supermarket)
## [1] 25382
#Initialize the contingency table
contigencyTable <- matrix(c(95, 37, 132, 1853, 30575, 32428, 1948, 30612, 32560), ncol
=3, byrow=TRUE)
col names (conti gencyTable) <- c("13973", "NOT 13973", "TOTAL")
rownames(conti gencyTable) <- c("9630", "NOT 9630", "TOTAL")</pre>
print(conti gencyTable)
##
            13973 NOT 13973 TOTAL
## 9630
               95
                          37 132
## NOT 9630 1853
                      30575 32428
## TOTAL
          1948
                  30612 32560
```

The contigency table for the rules is generatted by getting all the transactions where 9630 is present which is 132, where 13973 is present which is 1948 and where both 9630 and 13973 are present which is 95. The total number of the observables for the dataframe of the the supermarket.txt is 32560 observables.

```
F11 = 95, F1+ = 132, F+1 = 1948, TOTAL = 32560
```

```
#Filter the Rules Dataframe for where the item 13491 is present
subset13491 <- filter(supermarketDF, V1 == "13491" | V2 == "13491" | V3 == "1
3491" | V4 == "13491" | V5 == "13491" | V6 == "13491" | V7 == "13491" | V8 == "134
91" | V9 = "13491" | V10 = "13491" | V11 = "13491" )
#Total number of observables where
nrow(subset13491)
## [1] 127
#Filter the Rules Dataframe for where the item 5330 is present
subset5330 <- filter(supermarketDF, V1 == "5330" | V2 == "5330" | V3 == "5330"
" | V4 == "5330" | V5 == "5330" | V6 == "5330" | V7 == "5330" | V8 == "5330" | V9 =
= "5330" |V10 == "5330" |V11 == "5330" )
#Total number of observables where
nrow(subset5330)
## [1] 4958
#Filter the Rules Dataframe for where the item 13491 and 5330 are present
subset13491\_5330 \leftarrow filter(subset5330, V1 == "13491" | V2 == "13491" | V3 == 
"13491" |V4 == "13491" |V5 == "13491" |V6 == "13491" |V7 == "13491" |V8 == "1
3491" | V9 == "13491" | V10 == "13491" | V11 == "13491" )
#Total number of observables where 13491 and 5330 are present
nrow(subset13491 5330)
## [1] 97
#Initialize the contingency table
contigencyTable <- matrix(c(97, 30, 127, 4861, 27572, 32433, 4958, 27602, 32560), ncol
=3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("13491", "NOT 13491", "TOTAL")
print(conti gencyTable)
##
                                5330 NOT 5330 TOTAL
## 13491
                                    97
                                                           30
                                                                   127
## NOT 13491 4861
                                                   27572 32433
## TOTAL
                      4958 27602 32560
```

F11 = 97, F1+ = 127, F+1 = 4958, TOTAL = 32560

```
#Filter the Rules Dataframe for where the item 7466 is present
subset7466 <- filter(supermarketDF, V1 == "7466" | V2 == "7466" | V3 == "7466"
" |V4 == "7466" |V5 == "7466" |V6 == "7466" |V7 == "7466" |V8 == "7466" |V9 =
= "7466" |V10 == "7466" |V11 == "7466" )
#Total number of observables where
nrow(subset7466)
## [1] 149
#Filter the Rules Dataframe for where the item 7466 and 5330 are present
subset7466\_5330 \leftarrow filter(subset5330, V1 == "7466" | V2 == "7466" | V3 == "7466"
66" | V4 == "7466" | V5 == "7466" | V6 == "7466" | V7 == "7466" | V8 == "7466" | V9
== "7466" | V10 == "7466" | V11 == "7466" )
#Total number of observables where
nrow(subset7466_5330)
## [1] 127
#Initialize the contingency table
contigencyTable <- matrix(c(127, 22, 149, 4831, 27580, 32411, 4958, 27602, 32560), nco
I = 3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("7466", "NOT 7466", "TOTAL")
print(conti gencyTable)
##
                                   5330 NOT 5330 TOTAL
## 7466
                                      127
                                                                    22 149
## NOT 7466 4831
                                                           27580 32411
## TOTAL 4958
                                                   27602 32560
```

F11 = 127, F1+ = 149, F+1 = 4958, TOTAL = 32560

RULE 2449 => 5330

```
#Filter the Rules Dataframe for where the item 2449 is present subset2449 <- filter(supermarketDF, V1 == "2449" | V2 == "2449" | V3 == "2449" | V4 == "2449" | V5 == "2449" | V6 == "2449" | V7 == "2449" | V8 == "2449" | V9 = "2449" | V10 == "2449" | V11 == "2449" )

#Total number of observables where nrow(subset2449)

## [1] 133
```

```
#Filter the Rules Dataframe for where the item 2449 and 5330 are present
subset2449\_5330 \leftarrow filter(subset5330, V1 == "2449" | V2 == "2449" | V3 == "2489" | V3 == "2489"
49" | V4 == "2449" | V5 == "2449" | V6 == "2449" | V7 == "2449" | V8 == "2449" | V9
== "2449" |V10 == "2449" |V11 == "2449" )
#Total number of observables where
nrow(subset2449_5330)
## [1] 109
#Initialize the contingency table
contigencyTable <- matrix(c(109, 24, 133, 4849, 27578, 32427, 4958, 27602, 32560), nco
I = 3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("2449", "NOT 2449", "TOTAL")</pre>
print(conti gencyTable)
                                               5330 NOT 5330 TOTAL
##
## 2449
                                               109
                                                                                        24 133
## NOT 2449 4849
                                                                             27578 32427
## TOTAL 4958 27602 32560
```

F11 = 109, F1+ = 133, F+1 = 4958, TOTAL = 32560

RULE 12456 => 5330

```
#Filter the Rules Dataframe for where the item 12456 is present
subset12456 <- filter(supermarketDF, V1 == "12456" | V2 == "12456" | V3 == "1
2456" | V4 == "12456" | V5 == "12456" | V6 == "12456" | V7 == "12456" | V8 == "124
56" | V9 == "12456" | V10 == "12456" | V11 == "12456" |
#Total number of observables where
nrow(subset12456)
## [1] 178
#Filter the Rules Dataframe for where the item 12456 and 5330 are present
subset12456_5330 <- filter(subset5330, V1 == "12456" | V2 == "12456" | V3 ==
"12456" |V4 == "12456" |V5 == "12456" |V6 == "12456" |V7 == "12456" |V8 == "1
2456" | V9 == "12456" | V10 == "12456" | V11 == "12456" |
#Total number of observables where
nrow(subset12456_5330)
## [1] 86
#Initialize the contingency table
contigencyTable <- matrix(c(86, 92, 178, 4872, 27510, 32382, 4958, 27602, 32560), ncol
=3, byrow=TRUE)
```

```
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")
rownames(conti gencyTable) <- c("12456", "NOT 12456", "TOTAL")

print(conti gencyTable)

## 5330 NOT 5330 TOTAL

## 12456 86 92 178

## NOT 12456 4872 27510 32382

## TOTAL 4958 27602 32560</pre>
```

F11 = 86 F1 + = 178, F+1 = 4958, TOTAL = 32560

RULE 14914 => 5330

```
#Filter the Rules Dataframe for where the item 12456 is present
subset14914 <- filter(supermarketDF, V1 == "14914" | V2 == "14914" | V3 == "1
4914" | V4 == "14914" | V5 == "14914" | V6 == "14914" | V7 == "14914" | V8 == "149
14" | V9 == "14914" | V10 == "14914" | V11 == "14914" |
#Total number of observables where
nrow(subset14914)
## [1] 316
#Filter the Rules Dataframe for where the item 12456 and 5330 are present
subset14914_5330 <- filter(subset5330, V1 == "14914" | V2 == "14914" | V3 ==
"14914" |V4| = "14914" |V5| = "14914" |V6| = "14914" |V7| = "14914" |V8| = "1
4914" | V9 == "14914" | V10 == "14914" | V11 == "14914" )
#Total number of observables where
nrow(subset14914_5330)
## [1] 137
#Initialize the contingency table
contigencyTable <- matrix(c(137, 179, 316, 4821, 27423, 32244, 4958, 27602, 32560), nc
ol = 3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("14914", "NOT 14914", "TOTAL")</pre>
print(conti gencyTable)
##
             5330 NOT 5330 TOTAL
## 14914
              137
                       179
                              316
## NOT 14914 4821
                      27423 32244
## TOTAL 4958
                  27602 32560
```

F11 = 137 F1 + = 316, F+1 = 4958, TOTAL = 32560

```
#Filter the Rules Dataframe for where the item 12456 is present
subset12562 <- filter(supermarketDF, V1 == "12562" | V2 == "12562" | V3 == "1
2562" |V4 == "12562" |V5 == "12562" |V6 == "12562" |V7 == "12562" |V8 == "125
62" \mid V9 = "12562" \mid V10 = "12562" \mid V11 = "12562" )
#Total number of observables where
nrow(subset12562)
## [1] 475
#Filter the Rules Dataframe for where the item 12456 and 5330 are present
subset12562_5330 <- filter(subset5330, V1 == "12562" | V2 == "12562" | V3 ==
"12562" |V4 == "12562" |V5 == "12562" |V6 == "12562" |V7 == "12562" |V8 == "1
2562" | V9 == "12562" | V10 == "12562" | V11 == "12562" )
#Total number of observables where
nrow(subset12562_5330)
## [1] 308
#Initialize the contingency table
contigencyTable <- matrix(c(308, 167, 475, 4650, 27435, 32085, 4958, 27602, 32560), nc
ol = 3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("12562", "NOT 12562", "TOTAL")
print(conti gencyTable)
##
             5330 NOT 5330 TOTAL
## 12562
              308
                      167
                              475
                     27435 32085
## NOT 12562 4650
## TOTAL 4958 27602 32560
```

F11 = 308 F1 + = 475, F+1 = 4958, TOTAL = 32560

RULE {14914,9108} => 5330

```
#Filter the Rules Dataframe for where the item 14914 is present subset14914 <- filter(supermarketDF, V1 == "14914" | V2 == "14914" | V3 == "14914" | V4 == "14914" | V5 == "14914" | V6 == "14914" | V7 == "14914" | V8 == "14914" | V9 == "14914" | V10 == "14914" | V11 == "14914" )

#Total number of observables where subset14914 nrow(subset14914)

## [1] 316
```

```
#Filter the Rules Dataframe for where the item 14914 and 9108 are present
subset9108_14914 <- filter(subset14914, V1 == "9108" | V2 == "9108" | V3 == "
9108" | V4 == "9108" | V5 == "9108" | V6 == "9108" | V7 == "9108" | V8 == "9108" |
V9 == "9108" |V10 == "9108" |V11 == "9108" )
#Total number of observables where subset9108_14914
nrow(subset9108_14914)
## [1] 85
subset9108_14914_5330 <- filter(subset9108_14914, V1 == "5330" | V2 == "5330"
| V3 == "5330" | V4 == "5330" | V5 == "5330" | V6 == "5330" | V7 == "5330" | V8 ==
"5330" | V9 == "5330" | V10 == "5330" | V11 == "5330" |
nrow(subset9108_14914_5330)
## [1] 70
#Initialize the contingency table
contigencyTable <- matrix(c(70, 15, 85, 4888, 27587, 32475, 4958, 27602, 32560), ncol = 1000
3, byrow=TRUE)
col names(conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")</pre>
rownames(contigencyTable) <- c("{9108_14914}", "NOT {9108_14914}", "TOTAL")
print(conti gencyTable)
##
                     5330 NOT 5330 TOTAL
## {9108_14914}
                      70
                                15
                                       85
## NOT {9108_14914} 4888
                             27587 32475
## TOTAL
                     4958
                             27602 32560
```

F11 = 70 F1 + = 85, F+1 = 4958, TOTAL = 32560

RULE {14482,6385} => 14754

```
#Filter the Rules Dataframe for where the item 14482 is present subset14482 <- filter(supermarketDF, V1 == "14482" | V2 == "14482" | V3 == "14482" | V4 == "14482" | V5 == "14482" | V6 == "14482" | V7 == "14482" | V8 == "14482" | V9 == "14482" | V10 == "14482" | V11 == "14482" |
```

```
#Total number of observables where subset6385_14482
nrow(subset6385 14482)
## [1] 121
subset6385\_14482\_14754 < - filter(subset6385\_14482, V1 == "14754" | V2 == "14754" | V2 == "14754" | V3 == "14754" | V4 == "14754" | V5 == "1
54" | V3 == "14754" | V4 == "14754" | V5 == "14754" | V6 == "14754" | V7 == "1475
4" | V8 == "14754" | V9 == "14754" | V10 == "14754" | V11 == "14754"
#Total number of observables where subset6385_14482_14754
nrow(subset6385_14482_14754)
## [1] 83
#Filter the Rules Dataframe for where the item 14482 is present
subset14754 <- filter(supermarketDF, V1 == "14754" | V2 == "14754" | V3 == "1
4754" | V4 == "14754" | V5 == "14754" | V6 == "14754" | V7 == "14754" | V8 == "147
54" | V9 == "14754" | V10 == "14754" | V11 == "14754" | )
#Total number of observables where subset14754
nrow(subset14754)
## [1] 1656
#Initialize the contingency table
contigencyTable <- matrix(c(83, 38, 121, 1573, 30866, 32439, 1656, 30904, 32560), ncol
=3, byrow=TRUE)
col names (conti gencyTable) <- c("14754", "NOT 14754", "TOTAL")
rownames(contigencyTable) <- c("{14482,6385}", "NOT {14482,6385}", "TOTAL")
print(conti gencyTable)
##
                                                       14754 NOT 14754 TOTAL
## {14482,6385}
                                                               83
                                                                                            38
                                                                                                      121
## NOT {14482, 6385} 1573
                                                                                   30866 32439
## TOTAL
                                                                                   30904 32560
                                                          1656
```

F11 = 83 F1 + = 121, F+1 = 1656, TOTAL = 32560

RULE {14482,6385} => 9108

```
#Filter the Rules Dataframe for where the item 9108 is present subset9108 <- filter(supermarketDF, V1 == "9108" | V2 == "9108" | V3 == "9108" | V4 == "9108" | V5 == "9108" | V6 == "9108" | V7 == "9108" | V8 == "9108" | V9 = "9108" | V10 == "9108" | V11 == "9108" )

nrow(subset9108)
```

```
## [1] 5570
subset6385_14482_9108 <- filter(subset6385_14482, V1 == "9108" | V2 == "9108"
| V3 == "9108" | V4 == "9108" | V5 == "9108" | V6 == "9108" | V7 == "9108" | V8 ==
"9108" | V9 == "9108" | V10 == "9108" | V11 == "9108" )
#Total number of observables where subset6385_14482_14754
nrow(subset6385_14482_9108)
## [1] 103
#Initialize the contingency table
contigencyTable <- matrix(c(103, 18, 121, 5467, 26972, 32439, 5570, 26990, 32560), nco
I = 3, byrow=TRUE)
col names(conti gencyTable) <- c("9108", "NOT 9108", "TOTAL")</pre>
rownames(contigencyTable) <- c("{14482,6385}", "NOT {14482,6385}", "TOTAL")
print(conti gencyTable)
##
                     9108 NOT 9108 TOTAL
## {14482, 6385}
                     103
                                18 121
## NOT {14482,6385} 5467
                     5467
5570
                             26972 32439
## TOTAL
                             26990 32560
```

F11 = 103 F1 + = 121, F+1 = 5570, TOTAL = 32560

3. Discuss whether some other scores studied last week or in the lecture slides would help identify "more interesting" and different rules?

I believe the Odds ratios (f11.f00)/(f10.f01) will help identify more interesting and different rules because Odds ratios are used to compare the relative odds of the occurrence of the outcome of interestingness, given exposure to the variable of interest. It is a way to quantify how strongly the presence or absence of an item (e.g. 5330) is associated with the presence or absence of another item (e.g. 12456) in the supermarket.txt dataset

4. Given the ability to discover frequent itemsets and association rules, propose a strategy to use these tools to study different customer segments, shops, shopping times, or specific products.

Proposing a strategy will depend to a large extent on the labels of the data however the first step will be to find the frequency of products in the data set after which we match the frequency of the products in each shop. It will be sensible that after matching the frequency of the products in each shop we check out the times when these products were bought in each shop. We can also mine for the different times some specific products (with high

frequency) were bought in shops. For the customer segment it will then make sense to mine the frequent item sets in order to understand what group of items were bought (This should give us an idea of the different types of customers). Furthermore, we can also mine for which combinations were bought more in the shops.

5. Select some relatively high-support high-confidence rule (A->B) and based on that example describe the conditional probabilities P(A|B) and P(B|A), as well as the Bayes rule.

From my top 5 high confidence and high support, the rule with the highest confidence and support is

```
lhs rhs support confidence lift  \{12456\} => \{5330\} \quad 0.007012844 \qquad 1.0000000 \quad 5.119403
```

Considering the above let A = lhs and B = rhs hence A = 12456 B = 5330

Analyzing the contingency table for the rule "RULE 12456 => 5330"

```
#Filter the Rules Dataframe for where the item 12456 is present subset12456 <- filter(supermarketDF, V1 == "12456" | V2 == "12456" | V3 == "12456" | V4 == "12456" | V5 == "12456" | V6 == "12456" | V7 == "12456" | V8 == "12456" | V9 == "12456" | V10 == "12456" | V11 == "12456" )

#Total number of observables where nrow(subset12456)

## [1] 178

#Filter the Rules Dataframe for where the item 12456 and 5330 are present subset12456_5330 <- filter(subset5330, V1 == "12456" | V2 == "12456" | V3 == "12456" | V4 == "12456" | V5 == "12456" | V6 == "12456" | V7 == "12456" | V8 == "12456" | V9 == "12456" | V10 == "12456" | V11 == "12456" )

#Total number of observables where nrow(subset12456_5330)

## [1] 86
```

```
#Initialize the contingency table
contigencyTable <- matrix(c(86, 92, 178, 4872, 27510, 32382, 4958, 27602, 32560), ncol
=3, byrow=TRUE)
col names (conti gencyTable) <- c("5330", "NOT 5330", "TOTAL")
rownames(contigencyTable) <- c("12456", "NOT 12456", "TOTAL")
print(conti gencyTable)
##
              5330 NOT 5330 TOTAL
## 12456
                86
                          92
                               178
## NOT 12456 4872
                       27510 32382
          4958
## TOTAL
                      27602 32560
To calcultae p(A) P(A) = n(A)/n(S) where n(A) refers to number of A present n(A) = n(A)/n(S)
n(12456)
where n(S) total number in Sample space n(S) == n(Total)
From Contingency table n(12456) = 178
n(Total) = 32560
p(12456) = 178/32560 p(12456) = 0.00546683
To calcultae p(B) P(B) = n(B)/n(S) where n(B) refers to number of B present n(B) ==
n(5330)
where n(S) total number in Sample space n(S) == n(Total)
From Contingency table n(5330) = 4958
n(Total) = 32560
p(5330) = 4958/32560 p(5330) = 0.1522727
Now from the contingency table we have N(AnB) = 86
P(AnB) = n(AnB)/n(S) P(12456n5330) = 86/32560 P(12456n5330) = 0.002641278
Now we can calculate for P(A|B) and P(B|A)
P(A|B) = P(AnB)/P(B) = 0.002641278/0.1522727 = 0.01734571
P(B|A) = P(AnB)/P(A) = 0.002641278/0.00546683 = 0.4831462
Using the Bayes Rule P(A|B) = (P(B|A)P(A))/P(B)
Hence for Bayes Rule Have gotten the following
P(B|A) = 0.4831462 P(A) = 0.00546683 P(B) = 0.1522727
P(A|B) = (0.4831462*0.00546683)/0.1522727 = 0.01734571
```

From the above we can see that my earlier values for P(A|B) calculated without using the bayes rule corresponds with the P(A|B) using the Bayes rule

6. (Bonus 2p) Run Krimp on same data, provide commands and describe your findings and compare to FIM+Association rules. (link to Krimp documentation)