## Lab 09

## Riley Payung

## 4/6/2020

```
#Change the support to 0.1
frequentItems <- eclat (Groceries, parameter = list(supp = 0.07, maxlen = 15)) # calculates supp
ort for frequent items</pre>
```

```
## Eclat
##
## parameter specification:
   tidLists support minlen maxlen
                                              target
       FALSE
##
                0.07
                          1
                                15 frequent itemsets FALSE
##
## algorithmic control:
   sparse sort verbose
##
##
         7
           -2
                   TRUE
##
## Absolute minimum support count: 688
##
## create itemset ...
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.00s].
## sorting and recoding items ... [18 item(s)] done [0.00s].
## creating sparse bit matrix ... [18 row(s), 9835 column(s)] done [0.00s].
## writing ... [19 set(s)] done [0.00s].
## Creating S4 object ... done [0.00s].
```

```
inspect(frequentItems)
```

```
##
        items
                                     support
                                                 count
## [1] {other vegetables, whole milk} 0.07483477 736
## [2] {whole milk}
                                     0.25551601 2513
## [3]
       {other vegetables}
                                     0.19349263 1903
## [4] {rolls/buns}
                                     0.18393493 1809
## [5] {yogurt}
                                     0.13950178 1372
## [6] {soda}
                                     0.17437722 1715
## [7] {root vegetables}
                                     0.10899847 1072
## [8] {tropical fruit}
                                     0.10493137 1032
## [9] {bottled water}
                                     0.11052364 1087
## [10] {sausage}
                                     0.09395018
                                                 924
## [11] {shopping bags}
                                     0.09852567 969
## [12] {citrus fruit}
                                     0.08276563 814
## [13] {pastry}
                                     0.08896797 875
## [14] {pip fruit}
                                     0.07564820 744
## [15] {whipped/sour cream}
                                     0.07168277 705
## [16] {fruit/vegetable juice}
                                     0.07229283 711
## [17] {newspapers}
                                     0.07981698 785
## [18] {bottled beer}
                                     0.08052872 792
## [19] {canned beer}
                                     0.07768175 764
```

frequentItems <- eclat (Groceries, parameter = list(supp = 0.1, maxlen = 15)) # calculates suppo rt for frequent items

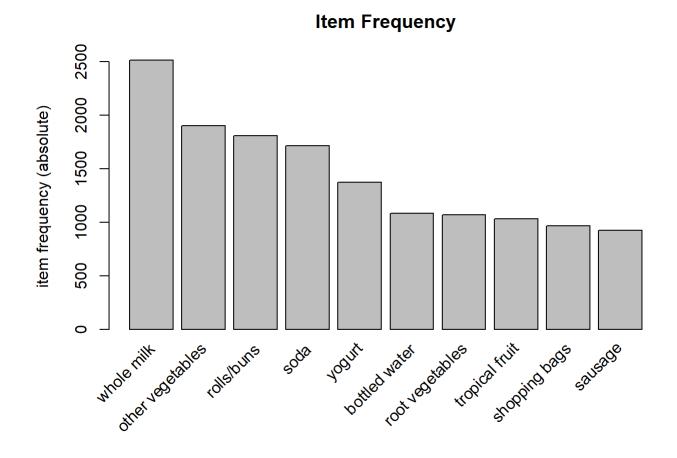
```
## Eclat
##
## parameter specification:
   tidLists support minlen maxlen
##
                                               target
                                                        ext
##
       FALSE
                                15 frequent itemsets FALSE
                 0.1
                          1
##
## algorithmic control:
##
    sparse sort verbose
##
         7
             -2
                   TRUE
##
## Absolute minimum support count: 983
##
## create itemset ...
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.00s].
## sorting and recoding items ... [8 item(s)] done [0.00s].
## creating bit matrix ... [8 row(s), 9835 column(s)] done [0.00s].
## writing ... [8 set(s)] done [0.00s].
## Creating S4 object ... done [0.00s].
```

```
inspect(frequentItems)
```

```
##
       items
                          support
                                     count
## [1] {whole milk}
                          0.2555160 2513
## [2] {other vegetables} 0.1934926 1903
## [3] {rolls/buns}
                          0.1839349 1809
## [4] {yogurt}
                          0.1395018 1372
## [5] {soda}
                          0.1743772 1715
## [6] {root vegetables} 0.1089985 1072
## [7] {tropical fruit}
                          0.1049314 1032
## [8] {bottled water}
                          0.1105236 1087
```

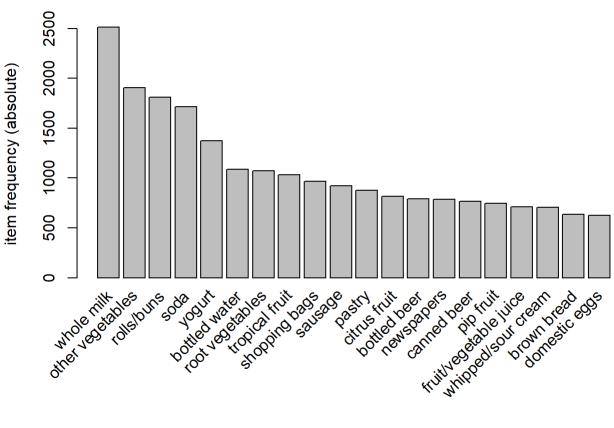
The data completely changes. Originally it contained a compound transaction {other vegetables,whole milk} which is now gone since the support was not greater than 0.1. In fact the support was 0.0748, hence why we were able to see the itemset before. {sausage} itemset is also gone since its support was also not greater than or equal to 0.1. In fact, its support was 0.0939, just below the threshold. The data also completely drops everything after the 9th itemset. The data is ordered based on support, where compound itemsets are displayed first.

```
#Change to TopN=20
itemFrequencyPlot(Groceries, topN=10, type="absolute", main="Item Frequency")
```



```
#Change to TopN=20
itemFrequencyPlot(Groceries, topN=20, type="absolute", main="Item Frequency")
```





Changing the topN to 20 just increases the amount of displayed data. Nothing new here.

rules <- apriori (Groceries, parameter = list(supp = 0.001, conf = 0.5)) # Min Support as 0.001, confidence as 0.8.

```
## Apriori
##
## Parameter specification:
##
    confidence minval smax arem aval original Support maxtime support minlen
##
                  0.1
                         1 none FALSE
                                                  TRUE
                                                                 0.001
##
    maxlen target
                    ext
##
        10 rules FALSE
##
## Algorithmic control:
    filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
##
                                          TRUE
##
## Absolute minimum support count: 9
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.01s].
## sorting and recoding items ... [157 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 5 6 done [0.02s].
## writing ... [5668 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

rules\_conf <- sort (rules, by="confidence", decreasing=TRUE) # 'high-confidence' rules.
inspect(head(rules conf)) # show the support, lift and confidence for all rules</pre>

```
##
       1hs
                                rhs
                                                         support confidence
                                                                                 lift count
## [1] {rice,
##
        sugar}
                             => {whole milk}
                                                    0.001220132
                                                                          1 3.913649
                                                                                         12
## [2] {canned fish,
##
        hygiene articles}
                             => {whole milk}
                                                    0.001118454
                                                                          1 3.913649
                                                                                         11
## [3] {root vegetables,
##
        butter,
                                                    0.001016777
                                                                          1 3.913649
##
        rice}
                             => {whole milk}
                                                                                         10
## [4] {root vegetables,
        whipped/sour cream,
##
##
        flour}
                             => {whole milk}
                                                    0.001728521
                                                                          1 3.913649
                                                                                         17
## [5] {butter,
##
        soft cheese,
##
        domestic eggs}
                             => {whole milk}
                                                    0.001016777
                                                                          1 3.913649
                                                                                         10
## [6] {citrus fruit,
##
        root vegetables,
        soft cheese}
                             => {other vegetables} 0.001016777
##
                                                                          1 5.168156
                                                                                         10
```

rules <- apriori (Groceries, parameter = list(supp = 0.1, conf = 0.5)) # Min Support as 0.001, confidence as 0.8.

```
## Apriori
##
## Parameter specification:
##
    confidence minval smax arem aval original Support maxtime support minlen
##
           0.5
                  0.1
                         1 none FALSE
                                                  TRUE
                                                                   0.1
##
    maxlen target
                    ext
##
        10 rules FALSE
##
## Algorithmic control:
    filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
##
                                          TRUE
##
## Absolute minimum support count: 983
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.01s].
## sorting and recoding items ... [8 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 done [0.00s].
## writing ... [0 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

```
rules_conf <- sort (rules, by="confidence", decreasing=TRUE) # 'high-confidence' rules.
inspect(head(rules_conf)) # show the support, lift and confidence for all rules</pre>
```

rules\_conf just ends up empty, however, if we change support to 0.01, the list completely changes. The itemsets are completely different.

```
rules <- apriori (Groceries, parameter = list(supp = 0.01, conf = 0.5)) # Min Support as 0.001, confidence as 0.8.
```

```
## Apriori
##
## Parameter specification:
##
    confidence minval smax arem aval original Support maxtime support minlen
##
                  0.1
                         1 none FALSE
                                                  TRUE
                                                                  0.01
##
    maxlen target
                    ext
##
        10 rules FALSE
##
## Algorithmic control:
    filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
##
                                          TRUE
##
## Absolute minimum support count: 98
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.00s].
## sorting and recoding items ... [88 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.01s].
## writing ... [15 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

rules\_conf <- sort (rules, by="confidence", decreasing=TRUE) # 'high-confidence' rules.
inspect(head(rules\_conf)) # show the support, lift and confidence for all rules

```
##
       1hs
                                           rhs
                                                              support
## [1] {citrus fruit,root vegetables}
                                        => {other vegetables} 0.01037112
## [2] {tropical fruit,root vegetables} => {other vegetables} 0.01230300
## [3] {curd,yogurt}
                                        => {whole milk}
                                                              0.01006609
## [4] {other vegetables,butter}
                                        => {whole milk}
                                                              0.01148958
## [5] {tropical fruit,root vegetables} => {whole milk}
                                                              0.01199797
## [6] {root vegetables, yogurt}
                                        => {whole milk}
                                                              0.01453991
       confidence lift
##
## [1] 0.5862069 3.029608 102
## [2] 0.5845411 3.020999 121
## [3] 0.5823529 2.279125 99
## [4] 0.5736041 2.244885 113
## [5] 0.5700483 2.230969 118
## [6] 0.5629921 2.203354 143
```

```
#Give me the high lift rules

rules_lift <- sort (rules, by="lift", decreasing=TRUE) # 'high-lift' rules.
inspect(head(rules_lift)) # show the support, lift and confidence for all rules</pre>
```

```
##
       1hs
                                           rhs
                                                              support
## [1] {citrus fruit,root vegetables}
                                        => {other vegetables} 0.01037112
## [2] {tropical fruit,root vegetables} => {other vegetables} 0.01230300
## [3] {root vegetables,rolls/buns}
                                        => {other vegetables} 0.01220132
## [4] {root vegetables,yogurt}
                                        => {other vegetables} 0.01291307
## [5] {curd, yogurt}
                                        => {whole milk}
                                                              0.01006609
## [6] {other vegetables,butter}
                                        => {whole milk}
                                                              0.01148958
##
       confidence lift
                           count
## [1] 0.5862069 3.029608 102
## [2] 0.5845411 3.020999 121
## [3] 0.5020921 2.594890 120
## [4] 0.5000000 2.584078 127
## [5] 0.5823529 2.279125 99
## [6] 0.5736041 2.244885 113
```

```
#Change support to .1
#Tells us who bought whole milk in addition to groceries

rules <- apriori (data=Groceries, parameter=list (supp=0.001,conf = 0.08), appearance = list (de fault="lhs",rhs="whole milk"), control = list (verbose=F)) # get rules that lead to buying 'whole milk'

rules_conf <- sort (rules, by="confidence", decreasing=TRUE) # 'high-confidence' rules.
inspect(head(rules_conf))</pre>
```

```
support confidence
                                                                          lift count
##
       lhs
                                rhs
## [1] {rice,
##
        sugar}
                             => {whole milk} 0.001220132
                                                                   1 3.913649
                                                                                  12
## [2] {canned fish,
                             => {whole milk} 0.001118454
##
        hygiene articles}
                                                                   1 3.913649
                                                                                  11
## [3] {root vegetables,
##
        butter,
        rice}
                             => {whole milk} 0.001016777
                                                                   1 3.913649
                                                                                  10
##
## [4] {root vegetables,
##
        whipped/sour cream,
##
        flour}
                             => {whole milk} 0.001728521
                                                                    1 3.913649
                                                                                  17
## [5] {butter,
##
        soft cheese,
                             => {whole milk} 0.001016777
##
        domestic eggs}
                                                                   1 3.913649
                                                                                  10
## [6] {pip fruit,
##
        butter,
##
        hygiene articles}
                            => {whole milk} 0.001016777
                                                                   1 3.913649
                                                                                  10
```

```
#Change support to .1
#Tells us who bought groceries in addition to whole milk

rules <- apriori (data=Groceries, parameter=list (supp=0.01,conf = 0.15,minlen=2), appearance =
   list(default="rhs",lhs="whole milk"), control = list (verbose=F)) # those who bought 'milk' als
   o bought..

rules_conf <- sort (rules, by="confidence", decreasing=TRUE) # 'high-confidence' rules.
inspect(head(rules_conf))</pre>
```

```
##
       1hs
                       rhs
                                          support
                                                     confidence lift
                                                                          count
## [1] {whole milk} => {other vegetables} 0.07483477 0.2928770
                                                                1.5136341 736
## [2] {whole milk} => {rolls/buns}
                                          0.05663447 0.2216474
                                                                1.2050318 557
## [3] {whole milk} => {yogurt}
                                          0.05602440 0.2192598
                                                                1.5717351 551
## [4] {whole milk} => {root vegetables} 0.04890696 0.1914047
                                                                1.7560310 481
## [5] {whole milk} => {tropical fruit}
                                          0.04229792 0.1655392
                                                                1.5775950 416
## [6] {whole milk} => {soda}
                                          0.04006101 0.1567847
                                                                0.8991124 394
```

## **Answer Section**

1. What are the top 20 items being purchased

The top 20 items that are being purchased are whole milk, other vegetables, rolls/buns, soda, yogurt, bottled water, root vegetables, tropical fruit, shopping bags, sausage, pastry, citrus fruit, bottled beer, newspapers, canned beer, pip fruit, fruit/vegetable juice, whipped/sour cream, brown bread, and domestic eggs.

- 2. Give me the top 10 rules given a 10% min support and .5 confidence
- [1] {whole milk} => {other vegetables} 0.07483477 0.2928770 1.5136341 736
- [2] {whole milk} => {rolls/buns} 0.05663447 0.2216474 1.2050318 557
- [3] {whole milk} => {yogurt} 0.05602440 0.2192598 1.5717351 551
- [4] {whole milk} => {root vegetables} 0.04890696 0.1914047 1.7560310 481
- [5] {whole milk} => {tropical fruit} 0.04229792 0.1655392 1.5775950 416
- [6] {whole milk} => {soda} 0.04006101 0.1567847 0.8991124 394
- 3. Tell us what people bought whole milk in addition to groceries

People who were buying vegetables, tropical fruits, soda, yogurt, rolls/buns, just generally when they go grocery shopping, they are buying whole milk in addition to the other items on their lists.

4. Tells us what people groceries in addition to whole milk.

Rolls/Buns, Yougurt, Soda, tropical fruits, bottled water, root vegetables. Most buy other vegetables along with their milk.

5. What story does this tell you about purchasing whole milk and groceries as a whole.

People who purchase other groceries at the grocery store also tend to buy whole milk. Generally, people tend to buy whole milk in most of the transactions this store handles.