Rule Mining

Allie Touchstone

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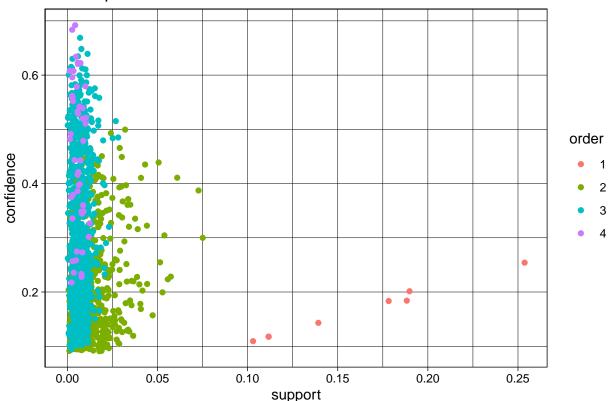
First we separated the data out into a format that the code could easily read. Then we put parameters on the data and are only looking at the data that has at more than a confidence of 0.005 and a support of 0.1.

The pertinent information from the summery of this subset from the groceries.txt file is that in all there are 1582 rules.

This is a plots of the rules where the groceries data is grouped off into 4 orders.

To reduce overplotting, jitter is added! Use jitter = 0 to prevent jitter.

Scatter plot for 1582 rules



These are the rules where the support is larger than 0.05.

lhs rhs support confidence coverage ## [1] {} => {bottled water} 0.11052364 0.1105236 1.0000000

```
## [2]
        {}
                            => {tropical fruit}
                                                    0.10493137 0.1049314
                                                                           1.000000
##
   [3]
        {}
                               {root vegetables}
                                                    0.10899847 0.1089985
                                                                           1.0000000
##
   [4]
        {}
                               {soda}
                                                    0.17437722 0.1743772
                                                                           1.0000000
   [5]
        {}
                            => {yogurt}
                                                    0.13950178 0.1395018
                                                                           1.0000000
##
##
   [6]
        {}
                               {rolls/buns}
                                                    0.18393493 0.1839349
                                                                           1.0000000
   [7]
        {}
##
                               {other vegetables} 0.19349263 0.1934926
                                                                           1.0000000
   [8]
        {}
                               {whole milk}
##
                                                    0.25551601 0.2555160
                                                                           1.0000000
   [9]
        {yogurt}
##
                               {whole milk}
                                                    0.05602440 0.4016035
                                                                           0.1395018
##
   [10] {whole milk}
                            =>
                               {yogurt}
                                                    0.05602440 0.2192598
                                                                           0.2555160
   [11] {rolls/buns}
                               {whole milk}
                                                    0.05663447 0.3079049
                                                                           0.1839349
   [12] {whole milk}
                            => {rolls/buns}
                                                    0.05663447 0.2216474
                                                                           0.2555160
   [13]
        {other vegetables} => {whole milk}
                                                    0.07483477 0.3867578
##
                                                                           0.1934926
##
        {whole milk}
                            => {other vegetables} 0.07483477 0.2928770
                                                                           0.2555160
##
        lift
## [1]
        1.000000 1087
##
   [2]
        1.000000 1032
   [3]
        1.000000 1072
##
##
   [4]
        1.000000 1715
   [5]
        1.000000 1372
##
##
   [6]
        1.000000 1809
##
   [7]
        1.000000 1903
  [8]
        1.000000 2513
##
  [9]
##
        1.571735
                   551
   [10] 1.571735
                   551
##
   [11] 1.205032
                   557
   [12] 1.205032
                   557
   [13] 1.513634
                   736
   [14] 1.513634
                   736
```

You can see from these rules which items are the top 8 grocery items bought on there own. Each item bought at least 1000 times a piece. (There are 9835 entrys in the data).

These are the rules where the confidence is larger than 0.6. While it might look overwhelming due to formatting issues, the reason this is being included is to point out the rhs column.

##		lhs		rhs		support	confidence	coverage	lift	count
##	[1]	{onions,								5 0
##		root vegetables}	=>	{other	vegetables}	0.005693950	0.6021505	0.009456024	3.112008	56
##	[2]	{curd,								I
##		tropical fruit}	=>	{whole	milk}	0.006507372	0.6336634	0.010269446	2.479936	64
##	[3]	{domestic eggs,								- 1
##		margarine}	=>	{whole	milk}	0.005185562	0.6219512	0.008337570	2.434099	51
##	[4]	{butter,								•
##		domestic eggs}	=>	{whole	milk}	0.005998983	0.6210526	0.009659380	2.430582	59
##	[5]	{butter,								- 1
##		whipped/sour cream}	=>	{whole	milk}	0.006710727	0.6600000	0.010167768	2.583008	66
##	[6]	{bottled water,								•
##		butter}	=>	{whole	milk}	0.005388917	0.6022727	0.008947636	2.357084	53
##	[7]	{butter,								
##		tropical fruit}	=>	{whole	milk}	0.006202339	0.6224490	0.009964413	2.436047	61
##	[8]	{butter,								
##		root vegetables}	=>	{whole	milk}	0.008235892	0.6377953	0.012913066	2.496107	81
##	[9]	{butter,								
##		yogurt}	=>	{whole	milk}	0.009354347	0.6388889	0.014641586	2.500387	92

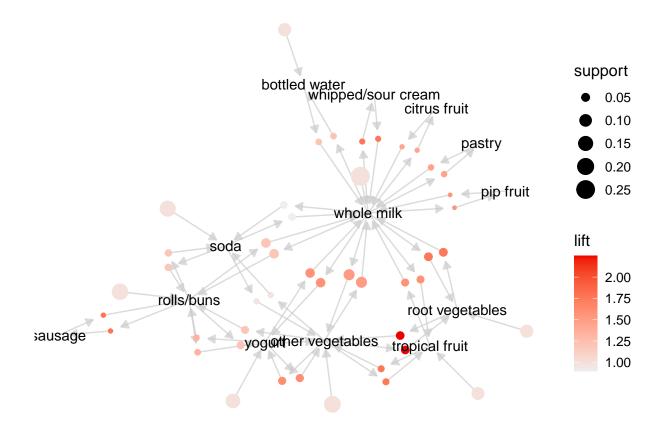
```
## [10] {domestic eggs,
                             => {whole milk}
                                                 ##
        pip fruit}
                                                                                             53
  [11] {domestic eggs,
##
        tropical fruit}
                             => {whole milk}
                                                 68
##
##
  [12] {pip fruit,
        whipped/sour cream}
                             => {other vegetables} 0.005592272  0.6043956 0.009252669 3.123610
##
                                                                                             55
## [13] {pip fruit,
##
        whipped/sour cream}
                             => {whole milk}
                                                 59
## [14] {fruit/vegetable juice,
        other vegetables,
##
##
        yogurt}
                             => {whole milk}
                                                 0.005083884
                                                             0.6172840 0.008235892 2.415833
                                                                                             50
  [15] {other vegetables,
##
##
        root vegetables,
        whipped/sour cream}
                             => {whole milk}
                                                             0.6071429 0.008540925 2.376144
##
                                                 0.005185562
## [16] {other vegetables,
##
        pip fruit,
                                                 0.005490595
                                                             0.6750000 0.008134215 2.641713
##
        root vegetables}
                             => {whole milk}
                                                                                             54
  [17] {pip fruit,
##
        root vegetables,
##
        whole milk}
                             => {other vegetables} 0.005490595
                                                             0.6136364 0.008947636 3.171368
                                                                                             54
##
  [18] {other vegetables,
##
        pip fruit,
                             => {whole milk}
                                                 0.005083884
                                                             0.6250000 0.008134215 2.446031
##
        yogurt}
                                                                                             50
## [19] {citrus fruit,
##
        root vegetables,
##
        whole milk}
                             => {other vegetables} 0.005795628
                                                             0.6333333 0.009150991 3.273165
                                                                                             57
  [20] {root vegetables,
##
##
        tropical fruit,
        yogurt}
                             => {whole milk}
                                                 0.005693950
                                                             0.7000000 0.008134215 2.739554
##
                                                                                             56
##
  [21] {other vegetables,
##
        tropical fruit,
##
        yogurt}
                             => {whole milk}
                                                 0.007625826
                                                             0.6198347 0.012302999 2.425816
                                                                                             75
## [22] {other vegetables,
##
        root vegetables,
##
        yogurt}
                             => {whole milk}
                                                 77
```

These rules show how whole milk is bought with just about everything, as well other vegetables are commonly bought with a wide variety of other items.

This first plot is considering all rules where the confidence and the support are greater than 0.03.

```
## set of 46 rules
##
## rule length distribution (lhs + rhs):sizes
   1 2
##
   8 38
##
##
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                                Max.
##
     1.000
             2.000
                      2.000
                              1.826
                                       2.000
                                               2.000
##
## summary of quality measures:
##
       support
                         confidence
                                            coverage
                                                                 lift
##
           :0.03010
                      Min.
                              :0.1049
                                        Min.
                                                :0.07168
                                                                   :0.8991
   Min.
                                                           Min.
    1st Qu.:0.03353
                      1st Qu.:0.1671
                                         1st Qu.:0.13950
                                                            1st Qu.:1.0488
```

```
Median : 0.04230
                       Median :0.2200
                                          Median : 0.19349
                                                             Median :1.4424
##
    Mean
            :0.06175
                       Mean
                               :0.2420
                                          Mean
                                                 :0.32140
                                                             Mean
                                                                     :1.3938
                                                             3rd Qu.:1.6007
##
    3rd Qu.:0.05648
                       3rd Qu.:0.3112
                                          3rd Qu.:0.25552
                               :0.4496
                                                 :1.00000
                                                                     :2.2466
##
    Max.
            :0.25552
                       Max.
                                          Max.
                                                             Max.
##
        count
##
            : 296.0
    Min.
##
    1st Qu.: 329.8
    Median : 416.0
##
##
    Mean
           : 607.3
##
    3rd Qu.: 555.5
##
    Max.
            :2513.0
##
  mining info:
##
##
         data ntransactions support confidence
##
    groceries
                         9835
                                0.005
                                              0.1
```



Following it up we have this graph used in gephi to break it up into 7 orders (each shown as a different color) and how the grocery items are connected.

This second group of plots is when there is a more stict set of rules on the data. Here the confidence has tp be larger than 0.3 and the support has to be larger than 0.03.

```
## set of 14 rules
##
## rule length distribution (lhs + rhs):sizes
## 2
```

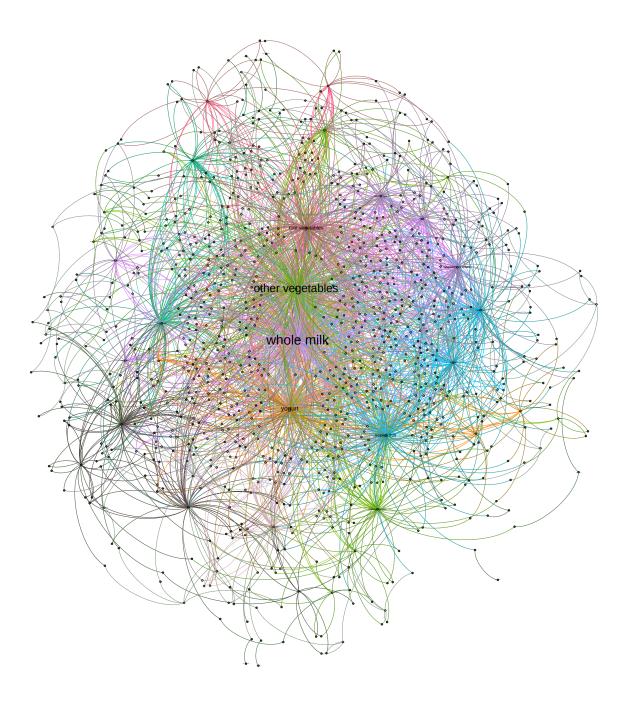
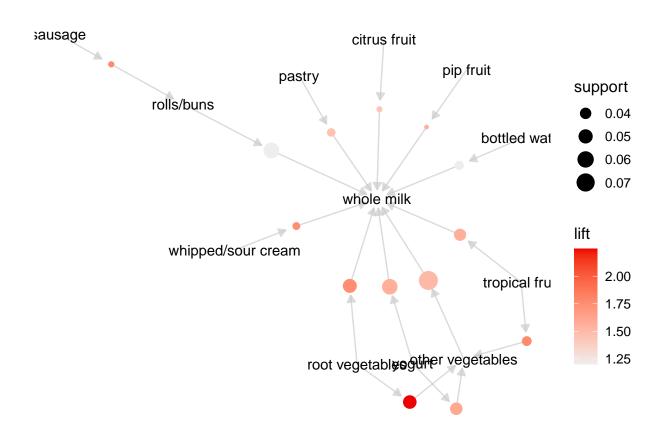


Figure 1: Support > 0.03, Confidence > 0.03

```
## 14
##
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                 2
                                  2
                                                   2
##
         2
                          2
                                          2
##
  summary of quality measures:
##
       support
                                                                 lift
##
                        confidence
                                            coverage
##
    Min.
           :0.03010
                      Min.
                              :0.3079
                                        Min.
                                                :0.07168
                                                           Min.
                                                                   :1.205
##
    1st Qu.:0.03249
                      1st Qu.:0.3298
                                        1st Qu.:0.09021
                                                           1st Qu.:1.475
                                        Median :0.10696
##
    Median :0.03910
                      Median :0.3802
                                                           Median :1.575
##
    Mean
           :0.04260
                      Mean
                              :0.3759
                                        Mean
                                                :0.11484
                                                           Mean
                                                                   :1.604
##
    3rd Qu.:0.04853
                       3rd Qu.:0.4027
                                         3rd Qu.:0.13226
                                                           3rd Qu.:1.759
                      Max. :0.4496
                                                :0.19349
##
    Max.
           :0.07483
                                        Max.
                                                           Max.
                                                                   :2.247
##
        count
##
           :296.0
    Min.
##
    1st Qu.:319.5
    Median :384.5
##
           :419.0
    3rd Qu.:477.2
##
##
    Max.
           :736.0
##
## mining info:
##
         data ntransactions support confidence
    groceries
                       9835
                               0.005
```



Once again, the following graph created in gephi breaks up the grocery items into 7 orders (each shown as

a different color) and how they items are connected to each other.

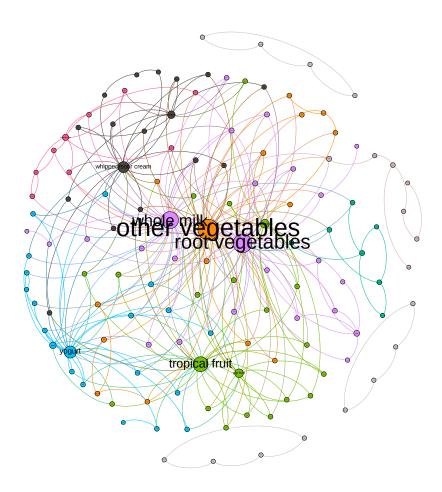


Figure 2: Support > 0.03, Confidence > 0.3

As we can see this is a much simpler visual of the data and both versions of the plot can help us easily determine certain things. Such as the first shows some of the other items commonly bought with groceries such as pasties, fruit, and bottle water. While in the second plot it is easier to what items are more connected to items in other groups, and how connected things like vegtables and whole milk are to the rest of the information.