Reading the data

First, we use the library "arules" as it is necessary to do association rule mining. Next, we use read transactions on groceries.txt, separating based on comma and setting a basket format.

```
library(arules) # has a big ecosystem of packages built around it

## Warning: package 'arules' was built under R version 3.2.2

## Loading required package: Matrix

##
## Attaching package: 'arules'

##
## The following objects are masked from 'package:base':

##
## %in%, write

groceries <- read.transactions("data/groceries.txt", format = 'basket', sep = ',')</pre>
```

Creating the rules

Next, we run the apriori algorithm on the groceries data. A support of .005 means that the algorithm will filter out any item sets that do not occur in at least .005 of the transactions. The confidence of .55 means that the left hand side will result in the right hand side at least 55% of the time. Finally, the maxlen of 5 means that the total number of items in both the right hand side and the left hand side can add up to at most 5.

```
groceriesrules <- apriori(groceries, parameter=list(support=.005, confidence=.59, maxlen=5))
```

```
##
  Parameter specification:
   confidence minval smax arem aval original Support support minlen maxlen
                  0.1
                         1 none FALSE
                                                         0.005
##
          0.59
                                                  TRUE
                                                                    1
##
   target
             ext
##
    rules FALSE
##
## Algorithmic control:
##
   filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
                                          TRUE
##
                                    2
##
## apriori - find association rules with the apriori algorithm
## version 4.21 (2004.05.09)
                                     (c) 1996-2004
                                                     Christian Borgelt
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[169 item(s), 9835 transaction(s)] done [0.00s].
## sorting and recoding items ... [120 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [23 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

Look at the output inspect(groceriesrules)

| ## | | lhs | | rhs | | support | confidence | lift |
|----------|----|--|-----|------------------|-------------|-------------|------------|----------|
| ## ## | 1 | <pre>{onions, root vegetables}</pre> | => | {other | vegetables} | 0.005693950 | 0.6021505 | 3.112008 |
| ## | 2 | {curd, | | | J | | | |
| ## | | tropical fruit} | => | {whole | milk} | 0.006507372 | 0.6336634 | 2.479936 |
| ## | 3 | {domestic eggs, | | ()] | | 0 005405500 | 0 0010510 | 0 404000 |
| ## | 1 | <pre>margarine} {butter,</pre> | => | {whole | milk} | 0.005185562 | 0.6219512 | 2.434099 |
| ## | 4 | domestic eggs} | => | {whole | milk} | 0.005998983 | 0.6210526 | 2.430582 |
| ## | 5 | {butter, | | (| | | 0.0220020 | 21100002 |
| ## | | whipped/sour cream} | => | $\{ {\tt whole}$ | milk} | 0.006710727 | 0.6600000 | 2.583008 |
| ## | 6 | {bottled water, | | | | | | |
| ## | - | butter} | => | {whole | milk} | 0.005388917 | 0.6022727 | 2.357084 |
| ## ## | 1 | {butter, | _\ | {whole | m: 71-1 | 0.006202339 | 0.6224490 | 0 426047 |
| ## | 8 | <pre>tropical fruit} {butter,</pre> | -/ | fMHOTE | mitk? | 0.000202339 | 0.0224490 | 2.430041 |
| ## | Ū | root vegetables} | => | {whole | milk} | 0.008235892 | 0.6377953 | 2.496107 |
| ## | 9 | {butter, | | | | | | |
| ## | | yogurt} | => | $\{ {\tt whole}$ | milk} | 0.009354347 | 0.6388889 | 2.500387 |
| | 10 | {domestic eggs, | | | | | | |
| ## | 11 | pip fruit} | => | {whole | milk} | 0.005388917 | 0.6235294 | 2.440275 |
| ## | 11 | {domestic eggs, tropical fruit} | => | {whole | milkl | 0.006914082 | 0.6071429 | 2 376144 |
| | 12 | {domestic eggs, | | OTOHWJ | milkj | 0.000014002 | 0.0071425 | 2.070144 |
| ## | | root vegetables} | => | {whole | milk} | 0.008540925 | 0.5957447 | 2.331536 |
| ## | 13 | {pip fruit, | | | | | | |
| ## | | whipped/sour cream} | => | {other | vegetables} | 0.005592272 | 0.6043956 | 3.123610 |
| ## | 14 | {pip fruit, | _ \ | (1 1 - | : 71-7 | 0 00500000 | 0 0402540 | 0 507404 |
| ## | 15 | <pre>whipped/sour cream} {fruit/vegetable juice,</pre> | => | {whole | mirk} | 0.005998983 | 0.6483516 | 2.53/421 |
| ## | 13 | other vegetables, | | | | | | |
| ## | | yogurt} | => | {whole | milk} | 0.005083884 | 0.6172840 | 2.415833 |
| ## | 16 | {other vegetables, | | | | | | |
| ## | | root vegetables, | | | | | | |
| ## | 47 | whipped/sour cream} | => | {whole | milk} | 0.005185562 | 0.6071429 | 2.376144 |
| ## | 17 | <pre>{other vegetables, pip fruit,</pre> | | | | | | |
| ## | | root vegetables} | => | {whole | milk} | 0.005490595 | 0.6750000 | 2.641713 |
| | 18 | {pip fruit, | | (| | 0.00010000 | | 2.012.10 |
| ## | | root vegetables, | | | | | | |
| ## | | whole milk} | => | {other | vegetables} | 0.005490595 | 0.6136364 | 3.171368 |
| | 19 | {other vegetables, | | | | | | |
| ## | | pip fruit, | _< | (h - 7 - | | 0 005003004 | 0 6050000 | 0 446021 |
| ## | 20 | <pre>yogurt} {citrus fruit,</pre> | => | {whole | MITK? | 0.005083884 | 0.6250000 | 2.446031 |
| ## | 20 | root vegetables, | | | | | | |
| ## | | whole milk} | => | {other | vegetables} | 0.005795628 | 0.6333333 | 3.273165 |
| ## | 21 | <pre>{root vegetables,</pre> | | | _ | | | |
| ## | | tropical fruit, | | _ | _ | | | |
| ## | | yogurt} | => | {whole | milk} | 0.005693950 | 0.7000000 | 2.739554 |

```
## 22 {other vegetables,
## tropical fruit,
## yogurt} => {whole milk} 0.007625826 0.6198347 2.425816
## 23 {other vegetables,
## root vegetables,
## yogurt} => {whole milk} 0.007829181 0.6062992 2.372842
```

Looking at the output, we can see that 23 rules were generated. Also, the right hand side always has only one item in it, and is either whole milk or other vegatables. This is a rather large set of rules, so we create subsets next to narrow down the number of rules.

Creating a subset based on lift

Next, we create a subset using a lift of at least 3.

##

whole milk}

```
## Choose a subset
inspect(subset(groceriesrules, subset=lift > 3))
##
     lhs
                             rhs
                                                     support confidence
                                                                             lift
## 1 {onions,
                          => {other vegetables} 0.005693950
##
      root vegetables}
                                                              0.6021505 3.112008
## 2 {pip fruit,
      whipped/sour cream} => {other vegetables} 0.005592272
                                                              0.6043956 3.123610
## 3 {pip fruit,
      root vegetables,
##
                          => {other vegetables} 0.005490595
##
      whole milk}
                                                              0.6136364 3.171368
## 4 {citrus fruit,
##
      root vegetables,
```

This subset contains only 4 rules, and the right hand side is always other vegetables. With this subset, we can that people who buy a variety of types of fruit and vegetables are also likely to buy other types of vegetables.

=> {other vegetables} 0.005795628 0.6333333 3.273165

Creating a subset based on confidence

Next, we create a subset based on confidence, using a confidence of .65.

```
inspect(subset(groceriesrules, subset=confidence > 0.65))
```

```
##
     lhs
                              rhs
                                                support confidence
                                                                        lift
## 1 {butter,
      whipped/sour cream} => {whole milk} 0.006710727
                                                             0.660 2.583008
## 2 {other vegetables,
##
      pip fruit,
                           => {whole milk} 0.005490595
                                                             0.675 2.641713
##
      root vegetables}
## 3 {root vegetables,
##
      tropical fruit,
      yogurt}
                           => {whole milk} 0.005693950
                                                             0.700 2.739554
```

This subset contains just three rules, and the right hand side is always whole milk. Therefore, we can infer that whole milk is the most common item to be included if we know about certain other items in the grocery basket.