Association Rule Mining

Bibek Sapkota

```
task 1: Install package
```

```
#install.packages("arules")
library("arules")
## Loading required package: Matrix
## Attaching package: 'arules'
  The following objects are masked from 'package:base':
##
##
       abbreviate, write
task 2:Importing and loading the data.
dataAR <- read.csv("weather.csv")</pre>
dataAR
##
       outlook temperature humidity windy play
## 1
                               high
         sunny
                     hot
                                       no
                                            no
## 2
                       hot
                               high
         sunny
                                     yes
## 3 overcast
                      hot
                               high
                                     no
                                           yes
                      mild
## 4
         rainy
                               high
                                       no
                                           yes
## 5
        rainy
                      cool
                            normal
                                     no
                                          yes
## 6
        rainy
                      cool normal
                                    yes
                                           no
## 7 overcast
                                    yes
                      cool normal
                                           yes
## 8
         sunny
                      mild
                               high
                                      no
                                            no
## 9
                      cool normal
         sunny
                                      no
                                           yes
## 10
         rainy
                      mild normal
                                      no
                                           yes
## 11
                      mild
                             normal
         sunny
                                      yes
                                           yes
## 12 overcast
                      mild
                               high
                                      yes
                                           yes
## 13 overcast
                      hot
                             normal
                                           yes
## 14
                      mild
         rainy
                               high
                                      yes
task 3: Applying apriori
rules <- apriori(dataAR)</pre>
## Warning: Column(s) 1, 2, 3, 4, 5 not logical or factor. Applying default
```

discretization (see '? discretizeDF').

```
## Apriori
##
## Parameter specification:
    confidence minval smax arem aval originalSupport maxtime support minlen
##
##
           0.8
                  0.1
                         1 none FALSE
                                                  TRUE
                                                             5
##
   maxlen target ext
##
        10 rules TRUE
##
  Algorithmic control:
##
   filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
                                          TRUE
##
##
  Absolute minimum support count: 1
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[12 item(s), 14 transaction(s)] done [0.00s].
## sorting and recoding items ... [12 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 done [0.00s].
## writing ... [53 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

task 4: Inspect the dataset

inspect(rules)

```
##
                                rhs
        lhs
                                                      support confidence coverage
                                                                                         lift count
  Г17
##
        {outlook=overcast}
                             => {play=yes}
                                                    0.2857143
                                                               1.0000000 0.2857143 1.555556
   [2]
        {temperature=cool}
                             => {humidity=normal}
                                                    0.2857143
                                                                1.0000000 0.2857143 2.000000
                                                                                                   4
##
   [3]
        {play=no}
                             => {humidity=high}
                                                    0.2857143
                                                                0.8000000 0.3571429 1.600000
                                                                                                   4
   [4]
                             => {play=yes}
                                                                0.8571429 0.5000000 1.333333
##
        {humidity=normal}
                                                    0.4285714
                                                                                                   6
##
   [5]
        {outlook=overcast,
##
         temperature=hot}
                             => {windy=no}
                                                    0.1428571
                                                                1.0000000 0.1428571 1.750000
                                                                                                   2
##
   [6]
        {outlook=overcast,
##
         windy=no}
                             => {temperature=hot}
                                                    0.1428571
                                                                1.0000000 0.1428571 3.500000
                                                                                                   2
   [7]
##
        {outlook=overcast,
##
         temperature=hot}
                             => {play=yes}
                                                    0.1428571
                                                                1.0000000 0.1428571 1.555556
##
   [8]
        {temperature=hot,
##
         play=yes}
                             => {outlook=overcast} 0.1428571
                                                                1.0000000 0.1428571 3.500000
                                                                                                   2
        {outlook=sunny,
##
   [9]
##
         temperature=hot}
                             => {play=no}
                                                    0.1428571
                                                                1.0000000 0.1428571 2.800000
                                                                                                   2
   [10] {temperature=hot,
##
                             => {outlook=sunny}
                                                    0.1428571
                                                                1.0000000 0.1428571 2.800000
##
         play=no}
                                                                                                   2
   [11] {outlook=sunny,
##
##
         temperature=hot}
                             => {humidity=high}
                                                    0.1428571
                                                               1.0000000 0.1428571 2.000000
                                                                                                   2
##
   [12] {temperature=hot,
                                                                1.0000000 0.1428571 2.000000
##
         play=no}
                             => {humidity=high}
                                                    0.1428571
                                                                                                   2
##
   [13] {temperature=hot,
                             => {windy=no}
                                                    0.1428571
                                                                1.0000000 0.1428571 1.750000
                                                                                                   2
##
         play=yes}
##
   [14] {outlook=overcast,
##
         windy=yes}
                             => {play=yes}
                                                                1.0000000 0.1428571 1.555556
                                                                                                   2
                                                    0.1428571
##
   [15] {outlook=overcast,
         humidity=high}
##
                             => {play=yes}
                                                    0.1428571 1.0000000 0.1428571 1.555556
                                                                                                   2
```

```
[16] {outlook=overcast,
##
         humidity=normal}
                                                     0.1428571
                                                                1.0000000 0.1428571 1.555556
                             => {play=yes}
                                                                                                    2
##
   [17] {outlook=overcast,
                                                                1.0000000 0.1428571 1.555556
##
         windy=no}
                             => {play=yes}
                                                     0.1428571
                                                                                                    2
##
   [18] {outlook=rainy,
         temperature=cool}
                                                    0.1428571
                                                                 1.0000000 0.1428571 2.000000
##
                             => {humidity=normal}
                                                                                                    2
   [19] {temperature=cool,
##
##
         windy=yes}
                             => {humidity=normal}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.000000
                                                                                                    2
##
   [20] {temperature=cool,
##
         windy=no}
                             => {humidity=normal}
                                                     0.1428571
                                                                 1.0000000 0.1428571 2.000000
                                                                                                    2
##
   [21] {temperature=cool,
                             => {humidity=normal}
                                                     0.2142857
                                                                 1.0000000 0.2142857 2.000000
##
         play=yes}
                                                                                                    3
##
   [22] {temperature=cool,
##
         windy=no}
                             => {play=yes}
                                                     0.1428571
                                                                 1.0000000 0.1428571 1.555556
                                                                                                    2
##
   [23] {outlook=sunny,
##
         play=no}
                                {humidity=high}
                                                     0.2142857
                                                                 1.0000000 0.2142857 2.000000
                                                                                                    3
   [24] {outlook=sunny,
##
##
         humidity=high}
                                 {play=no}
                                                     0.2142857
                                                                 1.0000000 0.2142857 2.800000
                                                                                                    3
##
   [25] {windy=no,
##
         play=no}
                                 {outlook=sunny}
                                                     0.1428571
                                                                 1.0000000 0.1428571 2.800000
                                                                                                    2
##
   [26] {outlook=sunny,
         humidity=normal}
                             => {play=yes}
                                                     0.1428571
                                                                 1.0000000 0.1428571 1.555556
                                                                                                    2
##
##
   [27] {outlook=sunny,
                                                                1.0000000 0.1428571 2.000000
##
         play=yes}
                             => {humidity=normal}
                                                     0.1428571
                                                                                                    2
##
   [28] {outlook=rainy,
##
         play=no}
                                 {windy=yes}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.333333
                                                                                                    2
   [29] {outlook=rainy,
##
                                                                 1.0000000 0.1428571 2.800000
##
         windy=yes}
                             => {play=no}
                                                     0.1428571
                                                                                                    2
   [30] {temperature=mild,
##
##
         play=no}
                             => {humidity=high}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.000000
                                                                                                    2
##
   [31] \{windy=no,
##
         play=no}
                                 {humidity=high}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.000000
                                                                                                    2
##
   [32] {outlook=rainy,
                                                                 1.0000000 0.1428571 2.333333
                                                                                                    2
##
         humidity=high}
                                 {temperature=mild} 0.1428571
   [33] {outlook=rainy,
##
                                                     0.2142857
                                                                 1.0000000 0.2142857 1.555556
                                                                                                    3
##
         windy=no}
                             => {play=yes}
##
   [34] {outlook=rainy,
##
                                                     0.2142857
                                                                 1.0000000 0.2142857 1.750000
                                                                                                    3
         play=yes}
                             => {windy=no}
   [35] {temperature=mild,
##
         humidity=normal}
                                                                 1.0000000 0.1428571 1.555556
##
                                                     0.1428571
                                                                                                    2
                             => {play=yes}
   [36] {humidity=normal,
##
         windy=no}
                             => {play=yes}
                                                     0.2857143
                                                                1.0000000 0.2857143 1.555556
                                                                                                    4
##
##
   [37] {outlook=overcast,
##
         temperature=hot,
##
         windy=no}
                             => {play=yes}
                                                     0.1428571
                                                                1.0000000 0.1428571 1.555556
                                                                                                    2
   [38] {outlook=overcast,
##
##
         temperature=hot,
##
         play=yes}
                             => {windy=no}
                                                     0.1428571
                                                                1.0000000 0.1428571 1.750000
                                                                                                    2
   [39] {temperature=hot,
##
##
         windy=no,
                             => {outlook=overcast} 0.1428571
                                                                1.0000000 0.1428571 3.500000
                                                                                                    2
##
         play=yes}
##
   [40] {outlook=overcast,
##
         windy=no,
##
         play=yes}
                             => {temperature=hot} 0.1428571 1.0000000 0.1428571 3.500000
                                                                                                    2
```

```
[41] {outlook=sunny,
##
         temperature=hot,
##
         play=no}
                             => {humidity=high}
                                                     0.1428571
                                                               1.0000000 0.1428571 2.000000
                                                                                                    2
   [42] {outlook=sunny,
##
##
         temperature=hot,
         humidity=high}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.800000
##
                             => {play=no}
                                                                                                    2
   [43] {temperature=hot,
##
         humidity=high,
##
##
         play=no}
                             => {outlook=sunny}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.800000
                                                                                                    2
   [44] {temperature=cool,
##
##
         humidity=normal,
         windy=no}
                                                                1.0000000 0.1428571 1.555556
                                                                                                    2
##
                             => {play=yes}
                                                     0.1428571
##
   [45] {temperature=cool,
         windy=no,
##
##
         play=yes}
                                                                1.0000000 0.1428571 2.000000
                                                                                                    2
                             => {humidity=normal}
                                                     0.1428571
   [46] {outlook=sunny,
         windy=no,
##
##
         play=no}
                             => {humidity=high}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.000000
                                                                                                    2
   [47] {outlook=sunny,
##
##
         humidity=high,
##
         windy=no}
                             => {play=no}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.800000
                                                                                                    2
   [48] {humidity=high,
##
         windy=no,
##
         play=no}
                             => {outlook=sunny}
                                                                1.0000000 0.1428571 2.800000
##
                                                     0.1428571
                                                                                                    2
##
   [49] {outlook=rainy,
##
         temperature=mild,
##
         windy=no}
                             => {play=yes}
                                                     0.1428571
                                                                1.0000000 0.1428571 1.555556
                                                                                                    2
##
   [50] {outlook=rainy,
         temperature=mild,
##
##
         play=yes}
                             => {windy=no}
                                                     0.1428571
                                                                1.0000000 0.1428571 1.750000
                                                                                                    2
##
   [51] {temperature=mild,
##
         windy=no,
##
         play=yes}
                             => {outlook=rainy}
                                                     0.1428571
                                                                1.0000000 0.1428571 2.800000
                                                                                                    2
   [52] {outlook=rainy,
##
##
         humidity=normal,
         windy=no}
                                                                1.0000000 0.1428571 1.555556
                                                                                                    2
##
                             => {play=yes}
                                                     0.1428571
##
   [53] {outlook=rainy,
##
         humidity=normal,
##
         play=yes}
                             => {windy=no}
                                                     0.1428571
                                                               1.0000000 0.1428571 1.750000
                                                                                                    2
```

task 5: Using Apriori algorithm mines association rules in dataAR with minimum 30% support and 30% confidence.

```
rules <- apriori(dataAR, parameter =list(supp=0.3, conf=0.3) )

## Warning: Column(s) 1, 2, 3, 4, 5 not logical or factor. Applying default
## discretization (see '? discretizeDF').

## Apriori
## Parameter specification:
## confidence minval smax arem aval originalSupport maxtime support minlen
## 0.3 0.1 1 none FALSE TRUE 5 0.3 1</pre>
```

```
##
   maxlen target ext
##
        10 rules TRUE
##
##
  Algorithmic control:
##
   filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                         TRUE
##
## Absolute minimum support count: 4
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[12 item(s), 14 transaction(s)] done [0.00s].
## sorting and recoding items ... [9 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 done [0.00s].
## writing ... [13 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

task 6:Display detailed information of the mined association rules.

inspect(rules)

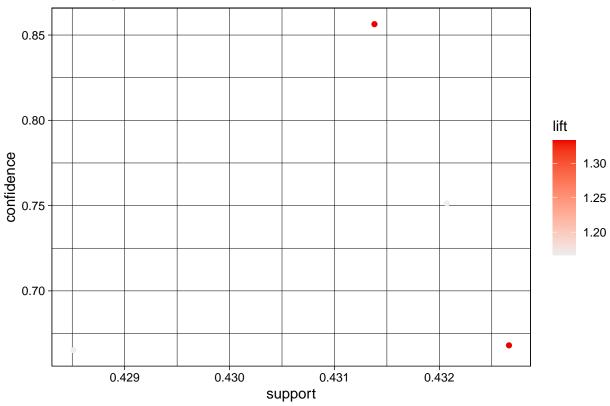
```
##
                              rhs
                                                  support
                                                             confidence coverage
##
  [1]
        {}
                           => {outlook=sunny}
                                                  0.3571429 0.3571429
                                                                         1.0000000
   [2]
        {}
                           => {play=no}
                                                  0.3571429 0.3571429
                                                                         1.0000000
   [3]
                           => {outlook=rainy}
##
        {}
                                                  0.3571429 0.3571429
                                                                         1.0000000
   [4]
                           => {windy=yes}
##
        {}
                                                  0.4285714 0.4285714
                                                                         1.0000000
   [5]
                           => {temperature=mild} 0.4285714 0.4285714
##
        {}
                                                                         1.0000000
  [6]
                           => {humidity=high}
##
        {}
                                                  0.5000000 0.5000000
                                                                         1.0000000
## [7]
        {}
                              {humidity=normal}
                                                  0.5000000 0.5000000
                                                                         1.0000000
## [8]
        {}
                           => {windy=no}
                                                  0.5714286 0.5714286
                                                                         1.0000000
## [9]
                           => {play=yes}
        {}
                                                  0.6428571 0.6428571
                                                                         1.0000000
  [10] {humidity=normal} => {play=yes}
                                                                         0.5000000
                                                  0.4285714 0.8571429
                           => {humidity=normal} 0.4285714 0.6666667
   [11] {play=yes}
                                                                         0.6428571
##
  [12]
       {windy=no}
                           => {play=yes}
                                                  0.4285714 0.7500000
                                                                         0.5714286
                           => {windy=no}
                                                  0.4285714 0.6666667
##
   [13] {play=yes}
                                                                         0.6428571
##
        lift
                  count
## [1]
        1.000000 5
   [2]
##
        1.000000 5
   [3]
        1.000000 5
   [4]
##
        1.000000 6
##
   [5]
        1.000000 6
   [6]
        1.000000 7
##
  [7]
        1.000000 7
##
## [8]
        1.000000 8
## [9]
        1.000000 9
## [10] 1.333333 6
  [11] 1.333333 6
  [12] 1.166667 6
## [13] 1.166667 6
```

task 7:Finds association rules in dataAR with 30% support, 30% confidence, and minimum length of 2.

```
rules <- apriori(dataAR, parameter =list (supp=0.3, conf=0.3, minlen=2 ) )</pre>
## Warning: Column(s) 1, 2, 3, 4, 5 not logical or factor. Applying default
## discretization (see '? discretizeDF').
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval originalSupport maxtime support minlen
                         1 none FALSE
                                                  TRUE
           0.3
                  0.1
##
   maxlen target ext
        10 rules TRUE
##
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
##
## Absolute minimum support count: 4
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[12 item(s), 14 transaction(s)] done [0.00s].
## sorting and recoding items ... [9 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 done [0.00s].
## writing ... [4 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
task 8: installing and loading the package
#install.packages("arulesViz")
library("arulesViz")
task 9:Ploting rules
plot(rules)
```

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

Scatter plot for 4 rules



task 10:Using alternative graph

```
plot(rules, method="graph", control = list(type="items"))
## Warning: Unknown control parameters: type
## Available control parameters (with default values):
## layout
            = stress
## circular = FALSE
## ggraphdots
               = NULL
## edges
           = <environment>
## nodes
            = <environment>
## nodetext = <environment>
            = c("#EE0000FF", "#EEEEEEFF")
## colors
## engine
            = ggplot2
## max
       = 100
## verbose
            = FALSE
```

