Perlombongan Aturan Sekutuan / Mining Association Rule

Left-hand-side and right-hand-side

$$X \to Y$$

Tiga ukur asas memilih aturan sekutuan

1. Support

support
$$(X \Rightarrow Y) = P(X \cap Y) = \frac{n_{XY}}{N}$$

2. Confidence

$$confidence(X \Rightarrow Y) = P(Y | X) = \frac{P(X \cap Y)}{P(X)} = \frac{\binom{n_{XY}/N}{N}}{\binom{n_{X}/N}{N}}$$

3. Lift

$$lift(X \Rightarrow Y) = \frac{confidence(X \Rightarrow Y)}{P(Y)} = \frac{P(X \cap Y)}{P(Y)P(X)} = \frac{\binom{n_{XY}}{N}}{\binom{n_{Y}}{N}}$$

- $lift(X \to Y) = 1$, X and Y tidak bersandar
- $\operatorname{lift}(X \to Y) > 1$, X dan Y mempunyai kesan pelengkap
- $lift(X \to Y) < 1$, X dan Y mempunyai kesan pengganti

Metric	What it Measures	Focus	Interpretation
Support	Frequency of the itemset	How common the rule is	Absolute measure of
C	D 1: 1:1:4 (.1 1	TT 4 41 1 :	occurrence
Confidence	Reliability of the rule	How strong the rule is	Conditional probability

Metric	What it Measures	Focus	Interpretation
Lift	Strength of association	Rule's importance	Relative to random chance

Algorithma Apriori

[8]

{bottled beer,

```
import data transaksi
tdata = read.transactions("E:/Master-Data-Science/Semester_1/Data_Mining/Data/groceries.csv", sep=',')
head(tdata, 10)
## transactions in sparse format with
## 10 transactions (rows) and
## 169 items (columns)
class(tdata)
## [1] "transactions"
## attr(,"package")
## [1] "arules"
Deskriptif data
inspect(head(tdata,12))
##
        items
##
  [1] {citrus fruit,
##
         margarine,
##
         ready soups,
##
         semi-finished bread}
## [2]
        {coffee,
##
         tropical fruit,
##
         yogurt}
## [3]
        {whole milk}
##
        {cream cheese,
##
         meat spreads,
##
         pip fruit,
##
         yogurt}
        {condensed milk,
##
##
         long life bakery product,
##
         other vegetables,
         whole milk}
##
## [6]
        {abrasive cleaner,
##
         butter,
##
         rice,
##
         whole milk,
##
         yogurt}
        {rolls/buns}
## [7]
```

```
liquor (appetizer),
##
##
         other vegetables,
         rolls/buns,
##
##
         UHT-milk}
## [9] {pot plants}
## [10] {cereals,
         whole milk}
## [11] {bottled water,
##
         chocolate,
##
         other vegetables,
##
         tropical fruit,
##
         white bread}
  [12] {bottled water,
##
##
         butter,
##
         citrus fruit,
##
         curd,
##
         dishes,
##
         flour,
##
         tropical fruit,
##
         whole milk,
##
         yogurt}
LIST(head(tdata, 10))
## [[1]]
## [1] "citrus fruit"
                              "margarine"
                                                     "ready soups"
## [4] "semi-finished bread"
##
## [[2]]
## [1] "coffee"
                         "tropical fruit" "yogurt"
##
## [[3]]
## [1] "whole milk"
## [[4]]
## [1] "cream cheese" "meat spreads" "pip fruit"
                                                      "yogurt"
##
## [[5]]
## [1] "condensed milk"
                                   "long life bakery product"
## [3] "other vegetables"
                                   "whole milk"
##
## [[6]]
## [1] "abrasive cleaner" "butter"
                                               "rice"
                                                                   "whole milk"
## [5] "yogurt"
##
## [[7]]
## [1] "rolls/buns"
##
## [[8]]
## [1] "bottled beer"
                             "liquor (appetizer)" "other vegetables"
## [4] "rolls/buns"
                             "UHT-milk"
##
## [[9]]
## [1] "pot plants"
```

```
##
## [[10]]
## [1] "cereals" "whole milk"

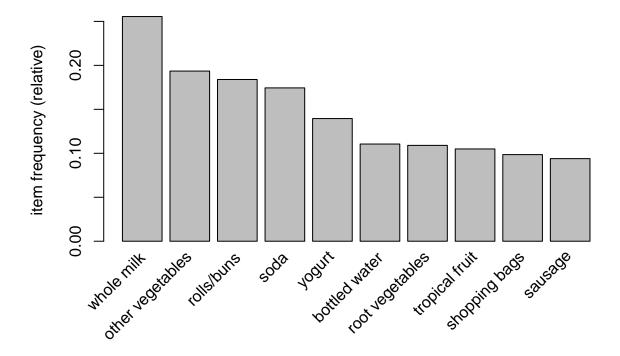
Bilangan item bagi setiap transaksi

size(head(tdata,10))

## [1] 4 3 1 4 4 5 1 5 1 2
```

Bagaimana untuk melihat item yang paling kerap dibeli?

10 Item paling kerap dibeli



Bagaimana untuk mendapatkan A turan Sekutuan yang signifikan bagi cadangan produk?

Perlu setkan nilai minimum ambang bagi sokongan dan keyakinan

```
Support = 0.01, Confidence = 0.5
```

```
Aturan.S1 = apriori(tdata,
                    parameter=list(supp=0.01, conf=0.3))
```

```
## Apriori
##
## Parameter specification:
   confidence minval smax arem aval original Support maxtime support minlen
##
           0.3
                         1 none FALSE
                                                 TRUE
                                                                  0.01
                  0.1
                                                             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: 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 [0.00s].
## writing ... [125 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
```

inspect(Aturan.S1)

```
##
       lhs
                               rhs
                                                 support confidence
                                                                  coverage
                                                                             lift cou
## [1]
       {hard cheese}
                             => {whole milk}
                                               ## [2]
       {butter milk}
                             => {other vegetables} 0.01037112 0.3709091 0.02796136 1.916916
## [3]
       {butter milk}
                             => {whole milk}
                                               ## [4]
                             => {whole milk}
       {ham}
                                               ## [5]
       {sliced cheese}
                             => {whole milk}
                                               0.01077783
                                                        0.4398340 0.02450432 1.721356
## [6]
       {oil}
                             => {whole milk}
                                               ## [7]
       {onions}
                             => {other vegetables} 0.01423488 0.4590164 0.03101169 2.372268
## [8]
                             => {whole milk}
       {onions}
                                               0.01209964
                                                        0.3901639 0.03101169 1.526965
## [9]
                             => {yogurt}
       {berries}
                                               0.01057448
                                                        0.3180428 0.03324860 2.279848
## [10]
      {berries}
                             => {other vegetables} 0.01026945 0.3088685 0.03324860 1.596280
## [11]
      {berries}
                             => {whole milk}
                                               0.01179461 0.3547401 0.03324860 1.388328
## [12]
       {hamburger meat}
                             => {other vegetables} 0.01382816 0.4159021 0.03324860 2.149447
## [13]
      {hamburger meat}
                             => {whole milk}
                                               0.01474326  0.4434251  0.03324860  1.735410
## [14]
       {hygiene articles}
                             => {whole milk}
                                               ## [15]
      {sugar}
                             => {other vegetables} 0.01077783 0.3183183 0.03385867 1.645119
## [16]
      {sugar}
                             => {whole milk}
                                               0.01504830
                                                        0.444444 0.03385867 1.739400
## [17]
      {waffles}
                             => {whole milk}
                                               ## [18]
      {long life bakery product} => {whole milk}
                                               => {other vegetables} 0.01159126  0.3123288 0.03711235 1.614164
## [19]
      {dessert}
## [20]
      {dessert}
                             => {whole milk}
                                               0.01372649
                                                        0.3698630 0.03711235 1.447514
## [21]
      {cream cheese}
                             => {yogurt}
                                               ## [22]
      {cream cheese}
                             => {other vegetables} 0.01372649 0.3461538 0.03965430 1.788977
## [23]
       {cream cheese}
                             => {whole milk}
                                               ## [24]
       {chicken}
                             => {other vegetables} 0.01789527 0.4170616 0.04290798 2.155439
```

1

1

1

1

1

1

1

1.

1

1

1

1

1

1

1

```
## [25]
         {chicken}
                                    => {whole milk}
                                                           0.01759024
                                                                       0.4099526 0.04290798 1.604411
                                                                                                        1
## [26]
         {white bread}
                                    => {other vegetables} 0.01372649
                                                                       0.3260870 0.04209456 1.685268
                                                                                                        1.
                                    => {whole milk}
## [27]
         {white bread}
                                                           0.01708185
                                                                       0.4057971 0.04209456 1.588147
                                                                                                        1
## [28]
         {chocolate}
                                    => {whole milk}
                                                           0.01667514
                                                                       0.3360656 0.04961871 1.315243
                                                                                                        1
## [29]
         {coffee}
                                    => {whole milk}
                                                           0.01870869
                                                                       0.3222417 0.05805796 1.261141
## [30]
         {frozen vegetables}
                                    => {other vegetables} 0.01779359
                                                                       0.3699789 0.04809354 1.912108
         {frozen vegetables}
## [31]
                                    => {whole milk}
                                                           0.02043721
                                                                       0.4249471 0.04809354 1.663094
## [32]
         {beef}
                                    => {root vegetables}
                                                           0.01738688
                                                                       0.3313953 0.05246568 3.040367
                                                                                                        1
## [33]
         {beef}
                                    => {other vegetables} 0.01972547
                                                                       0.3759690 0.05246568 1.943066
                                                                                                        1
## [34]
         {beef}
                                    => {whole milk}
                                                           0.02125064
                                                                       0.4050388 0.05246568 1.585180
                                                                                                        2
## [35]
         {curd}
                                    => {yogurt}
                                                           0.01728521
                                                                       0.3244275 0.05327911 2.325615
## [36]
         {curd}
                                    => {other vegetables} 0.01718353
                                                                       0.3225191 0.05327911 1.666829
                                                                                                        1
## [37]
         {curd}
                                    => {whole milk}
                                                           0.02613116
                                                                       0.4904580 0.05327911 1.919481
## [38]
         {napkins}
                                    => {whole milk}
                                                           0.01972547
                                                                       0.3766990 0.05236401 1.474268
## [39]
                                    => {other vegetables} 0.02165735
                                                                                                        2
         {pork}
                                                                       0.3756614 0.05765125 1.941476
## [40]
         {pork}
                                    => {whole milk}
                                                           0.02216573
                                                                       0.3844797 0.05765125 1.504719
                                                                                                        2
## [41]
         {frankfurter}
                                    => {rolls/buns}
                                                           0.01921708
                                                                       0.3258621 0.05897306 1.771616
                                                                                                        1
## [42]
         {frankfurter}
                                    => {whole milk}
                                                           0.02053889
                                                                       0.3482759 0.05897306 1.363029
                                                                                                        2
## [43]
         {brown bread}
                                    => {whole milk}
                                                           0.02521607
                                                                       0.3887147 0.06487036 1.521293
                                                                                                        2
## [44]
         {margarine}
                                    => {other vegetables} 0.01972547
                                                                       0.3368056 0.05856634 1.740663
## [45]
         {margarine}
                                    => {whole milk}
                                                           0.02419929
                                                                       0.4131944 0.05856634 1.617098
## [46]
         {butter}
                                                                       0.3614679 0.05541434 1.868122
                                    => {other vegetables} 0.02003050
         {butter}
## [47]
                                    => {whole milk}
                                                           0.02755465
                                                                       0.4972477 0.05541434 1.946053
                                                                                                        2
         {newspapers}
## [48]
                                    => {whole milk}
                                                           0.02735130
                                                                       0.3426752 0.07981698 1.341110
                                                                                                        2
## [49]
         {domestic eggs}
                                    => {other vegetables} 0.02226741
                                                                       0.3509615 0.06344687 1.813824
                                                                                                        2
## [50]
         {domestic eggs}
                                    => {whole milk}
                                                           0.02999492
                                                                       0.4727564 0.06344687 1.850203
                                                                                                        2
## [51]
         {fruit/vegetable juice}
                                                                       0.3684951 0.07229283 1.442160
                                                                                                        2
                                    => {whole milk}
                                                           0.02663955
## [52]
         {whipped/sour cream}
                                    => {other vegetables} 0.02887646
                                                                       0.4028369 0.07168277 2.081924
                                                                                                        2
## [53]
         {whipped/sour cream}
                                    => {whole milk}
                                                           0.03223183
                                                                       0.4496454 0.07168277 1.759754
## [54]
         {pip fruit}
                                    => {other vegetables} 0.02613116
                                                                       0.3454301 0.07564820 1.785237
## [55]
         {pip fruit}
                                    => {whole milk}
                                                           0.03009659
                                                                       0.3978495 0.07564820 1.557043
                                                                                                        2
## [56]
         {pastry}
                                    => {whole milk}
                                                           0.03324860
                                                                       0.3737143 0.08896797 1.462587
                                                                                                        3
## [57]
         {citrus fruit}
                                    => {other vegetables} 0.02887646
                                                                       0.3488943 0.08276563 1.803140
                                                                                                        2
## [58]
         {citrus fruit}
                                    => {whole milk}
                                                           0.03050330
                                                                       0.3685504 0.08276563 1.442377
                                                                                                        3
## [59]
         {sausage}
                                    => {rolls/buns}
                                                           0.03060498
                                                                       0.3257576 0.09395018 1.771048
## [60]
         {sausage}
                                    => {whole milk}
                                                           0.02989324
                                                                       0.3181818 0.09395018 1.245252
## [61]
         {bottled water}
                                    => {whole milk}
                                                           0.03436706
                                                                       0.3109476 0.11052364 1.216940
## [62]
         {tropical fruit}
                                    => {other vegetables} 0.03589222
                                                                       0.3420543 0.10493137 1.767790
## [63]
         {tropical fruit}
                                                           0.04229792
                                                                       0.4031008 0.10493137 1.577595
                                    => {whole milk}
## [64]
         {root vegetables}
                                    => {other vegetables} 0.04738180
                                                                       0.4347015 0.10899847 2.246605
## [65]
         {root vegetables}
                                    => {whole milk}
                                                           0.04890696
                                                                       0.4486940 0.10899847 1.756031
## [66]
         {yogurt}
                                    => {other vegetables} 0.04341637
                                                                       0.3112245 0.13950178 1.608457
                                                                                                        4
## [67]
         {yogurt}
                                    => {whole milk}
                                                           0.05602440
                                                                       0.4016035 0.13950178 1.571735
## [68]
         {rolls/buns}
                                    => {whole milk}
                                                           0.05663447
                                                                       0.3079049 0.18393493 1.205032
## [69]
         {other vegetables}
                                    => {whole milk}
                                                           0.07483477
                                                                       0.3867578 0.19349263 1.513634
## [70]
         {curd,
##
          yogurt}
                                    => {whole milk}
                                                           0.01006609
                                                                      0.5823529 0.01728521 2.279125
##
  [71]
         {curd,
##
                                    => {yogurt}
                                                           whole milk}
##
  [72]
         {other vegetables,
          pork}
                                    => {whole milk}
                                                           ##
## [73]
         {pork,
                                    => {other vegetables} 0.01016777  0.4587156 0.02216573 2.370714
##
          whole milk}
                                                                                                       1
## [74]
         {butter,
```

```
other vegetables}
                                 => {whole milk}
                                                      ##
## [75]
        {butter,
##
         whole milk}
                                  => {other vegetables} 0.01148958
                                                                  0.4169742 0.02755465 2.154987
        {domestic eggs,
## [76]
##
         other vegetables}
                                  => {whole milk}
                                                      0.01230300
                                                                 0.5525114 0.02226741 2.162336
        {domestic eggs,
## [77]
                                  => {other vegetables} 0.01230300
                                                                 0.4101695 0.02999492 2.119820
##
         whole milk}
## [78]
        {fruit/vegetable juice,
##
         other vegetables}
                                  => {whole milk}
                                                      0.01047280
                                                                 0.4975845 0.02104728 1.947371
                                                                                                1
## [79]
        {fruit/vegetable juice,
##
         whole milk}
                                 => {other vegetables} 0.01047280
                                                                 0.3931298 0.02663955 2.031756
                                                                                                1
        {whipped/sour cream,
##
  [80]
##
         yogurt}
                                 => {other vegetables} 0.01016777
                                                                 0.4901961 0.02074225 2.533410
                                                                                                1
        {other vegetables,
##
  [81]
         whipped/sour cream}
                                  => {yogurt}
                                                                 0.3521127 0.02887646 2.524073
##
                                                      0.01016777
                                                                                                1
##
  [82]
        {whipped/sour cream,
                                                                 0.5245098 0.02074225 2.052747
##
         yogurt}
                                 => {whole milk}
                                                      0.01087951
                                                                                                1
  [83]
        {whipped/sour cream,
##
                                  => {yogurt}
                                                      0.01087951 0.3375394 0.03223183 2.419607
##
         whole milk}
                                                                                                1
##
  [84]
        {other vegetables,
                                  => {whole milk}
##
         whipped/sour cream}
                                                      0.01464159 0.5070423 0.02887646 1.984385
                                                                                                1
## [85]
        {whipped/sour cream,
         whole milk}
                                  => {other vegetables} 0.01464159 0.4542587 0.03223183 2.347679
##
                                                                                                1
        {other vegetables,
## [86]
         pip fruit}
                                                      ##
                                 => {whole milk}
                                                                                                1
##
  [87]
        {pip fruit,
         whole milk}
                                 => {other vegetables} 0.01352313  0.4493243 0.03009659 2.322178
                                                                                                1
##
##
  [88]
        {other vegetables,
                                 => {whole milk}
                                                      ##
         pastry}
                                                                                                1
## [89]
        {pastry,
##
         whole milk}
                                 => {other vegetables} 0.01057448 0.3180428 0.03324860 1.643695
                                                                                                1
## [90]
        {citrus fruit,
##
         root vegetables}
                                 => {other vegetables} 0.01037112
                                                                 0.5862069 0.01769192 3.029608
        {citrus fruit,
##
  [91]
         other vegetables}
                                 => {root vegetables} 0.01037112 0.3591549 0.02887646 3.295045
##
## [92]
        {citrus fruit,
##
         yogurt}
                                  => {whole milk}
                                                      ## [93]
        {citrus fruit,
         whole milk}
                                  => {yogurt}
                                                      ##
                                                                                                1
        {citrus fruit,
## [94]
         other vegetables}
                                 => {whole milk}
                                                      ##
                                                                                                1
        {citrus fruit,
##
  [95]
##
         whole milk}
                                 => {other vegetables} 0.01301474 0.4266667 0.03050330 2.205080
                                                                                                1
##
  [96]
        {other vegetables,
                                  => {whole milk}
##
         sausage}
                                                      0.01016777
                                                                 0.3773585 0.02694459 1.476849
                                                                                                1
## [97]
        {sausage,
##
         whole milk}
                                 => {other vegetables} 0.01016777
                                                                 0.3401361 0.02989324 1.757876
                                                                                                1
##
  [98]
        {bottled water,
##
         other vegetables}
                                 => {whole milk}
                                                      0.01077783
                                                                 0.4344262 0.02480935 1.700192
                                                                                                1
##
  [99]
        {bottled water,
                                 => {other vegetables} 0.01077783 0.3136095 0.03436706 1.620783
##
         whole milk}
                                                                                                1
## [100] {root vegetables,
##
         tropical fruit}
                                 => {other vegetables} 0.01230300 0.5845411 0.02104728 3.020999
                                                                                                1
```

[101] {other vegetables,

```
tropical fruit}
                               => {root vegetables} 0.01230300 0.3427762 0.03589222 3.144780
## [102] {root vegetables,
        tropical fruit}
                                                              0.5700483 0.02104728 2.230969
##
                               => {whole milk}
                                                   0.01199797
## [103] {tropical fruit,
##
        yogurt}
                                => {other vegetables} 0.01230300 0.4201389 0.02928317 2.171343
## [104] {other vegetables,
        tropical fruit}
                                => {yogurt}
                                                   ##
## [105] {tropical fruit,
##
        yogurt}
                               => {whole milk}
                                                   1
## [106] {tropical fruit,
        whole milk}
                               => {yogurt}
                                                   0.01514997
                                                             0.3581731 0.04229792 2.567516
                                                                                          1
## [107] {rolls/buns,
                               => {whole milk}
                                                   ##
        tropical fruit}
                                                                                          1
## [108] {other vegetables,
                               => {whole milk}
                                                   ##
        tropical fruit}
                                                                                          1
## [109] {tropical fruit,
                               => {other vegetables} 0.01708185  0.4038462 0.04229792 2.087140
##
        whole milk}
                                                                                          1
  [110] {root vegetables,
                               => {other vegetables} 0.01291307
                                                             0.5000000 0.02582613 2.584078
                                                                                          1
##
        yogurt}
## [111] {root vegetables,
##
        yogurt}
                               => {whole milk}
                                                   1
## [112] {rolls/buns,
        root vegetables}
                               => {other vegetables} 0.01220132  0.5020921 0.02430097 2.594890
##
                                                                                          1
## [113] {rolls/buns,
                               => {whole milk}
                                                   0.01270971 0.5230126 0.02430097 2.046888
##
        root vegetables}
                                                                                          1
## [114] {other vegetables,
        root vegetables}
                               => {whole milk}
                                                   2
##
## [115] {root vegetables,
                                                                                          2
        whole milk}
                               => {other vegetables} 0.02318251 0.4740125 0.04890696 2.449770
##
## [116] {other vegetables,
##
         whole milk}
                               => {root vegetables}
                                                   0.02318251
                                                             0.3097826 0.07483477 2.842082
                                                                                          2
## [117] {soda,
##
        yogurt}
                               => {whole milk}
                                                   0.01047280
                                                              0.3828996 0.02735130 1.498535
                                                                                          1
  [118] {other vegetables,
##
         soda}
                               => {whole milk}
                                                   ##
## [119] {soda,
                               => {other vegetables} 0.01392984  0.3477157 0.04006101 1.797049
##
        whole milk}
## [120] {rolls/buns,
         yogurt}
                                => {other vegetables} 0.01148958 0.3343195 0.03436706 1.727815
##
## [121] {rolls/buns,
                               => {whole milk}
                                                   0.01555669
                                                              0.4526627 0.03436706 1.771563
                                                                                          1
        yogurt}
## [122] {other vegetables,
        yogurt}
                               => {whole milk}
                                                   2
##
## [123] {whole milk,
                               => {other vegetables} 0.02226741
                                                             0.3974592 0.05602440 2.054131
##
        yogurt}
                                                                                          2
## [124] {other vegetables,
                                                              0.4200477 0.04260295 1.643919
##
        rolls/buns}
                               => {whole milk}
                                                   0.01789527
                                                                                          1
## [125] {rolls/buns,
##
        whole milk}
                               => {other vegetables} 0.01789527 0.3159785 0.05663447 1.633026
                                                                                          1
```

Lihat aturan dengan tertib lif menurun

```
lift cou
##
         lhs
                                       rhs
                                                             support confidence
                                                                                  coverage
## [1]
         {citrus fruit,
##
         other vegetables}
                                    => {root vegetables}
                                                         0.01037112  0.3591549  0.02887646  3.295045
                                                                                                      1
## [2]
         {other vegetables,
##
         tropical fruit}
                                    => {root vegetables}
                                                          0.01230300
                                                                      0.3427762 0.03589222 3.144780
                                                                                                      1
## [3]
         {beef}
                                    => {root vegetables}
                                                         0.01738688
                                                                      0.3313953 0.05246568 3.040367
  [4]
##
         {citrus fruit,
##
         root vegetables}
                                    => {other vegetables} 0.01037112
                                                                      0.5862069 0.01769192 3.029608
                                                                                                      1
         {root vegetables,
##
  [5]
          tropical fruit}
                                    => {other vegetables} 0.01230300
                                                                      0.5845411 0.02104728 3.020999
##
## [6]
         {other vegetables,
         whole milk}
                                    => {root vegetables} 0.02318251
                                                                      0.3097826 0.07483477 2.842082
                                                                                                      2
##
## [7]
         {curd,
                                    => {yogurt}
                                                                      0.3852140 0.02613116 2.761356
##
         whole milk}
                                                          0.01006609
## [8]
         {rolls/buns,
         root vegetables}
##
                                    => {other vegetables} 0.01220132  0.5020921 0.02430097 2.594890
                                                                                                      1
##
  [9]
         {root vegetables,
         yogurt}
##
                                    => {other vegetables} 0.01291307
                                                                      0.5000000 0.02582613 2.584078
                                                                                                      1
## [10]
         {tropical fruit,
##
          whole milk}
                                    => {yogurt}
                                                          0.01514997
                                                                      0.3581731 0.04229792 2.567516
                                                                                                      1
## [11]
         {whipped/sour cream,
##
         yogurt}
                                    => {other vegetables} 0.01016777 0.4901961 0.02074225 2.533410
                                                                                                      1
##
  [12]
         {other vegetables,
          whipped/sour cream}
                                    => {yogurt}
                                                          0.01016777
                                                                      0.3521127 0.02887646 2.524073
                                                                                                      1
##
## [13]
         {other vegetables,
##
          tropical fruit}
                                    => {yogurt}
                                                          1
## [14]
         {root vegetables,
          whole milk}
                                    => {other vegetables} 0.02318251 0.4740125 0.04890696 2.449770
                                                                                                      2
##
## [15]
         {whipped/sour cream,
         whole milk}
                                                          0.01087951 0.3375394 0.03223183 2.419607
                                    => {yogurt}
                                                                                                      1
##
## [16]
         {citrus fruit,
          whole milk}
                                    => {yogurt}
                                                          0.01026945
                                                                      0.3366667 0.03050330 2.413350
                                                                                                      1
##
## [17]
        {onions}
                                    => {other vegetables} 0.01423488
                                                                      0.4590164 0.03101169 2.372268
                                                                                                      1
## [18]
        {pork,
##
         whole milk}
                                    => {other vegetables} 0.01016777
                                                                      0.4587156 0.02216573 2.370714
                                                                                                      1
         {whipped/sour cream,
## [19]
##
          whole milk}
                                                                      0.4542587 0.03223183 2.347679
                                    => {other vegetables} 0.01464159
                                                                                                      1
## [20]
         {curd}
                                    => {yogurt}
                                                          0.01728521
                                                                      0.3244275 0.05327911 2.325615
## [21]
         {pip fruit,
##
          whole milk}
                                    => {other vegetables} 0.01352313
                                                                      0.4493243 0.03009659 2.322178
                                                                                                      1
## [22]
         {berries}
                                    => {yogurt}
                                                          0.01057448
                                                                      0.3180428 0.03324860 2.279848
                                                                                                      1
## [23]
         {curd,
##
         yogurt}
                                    => {whole milk}
                                                          0.01006609
                                                                      0.5823529 0.01728521 2.279125
## [24]
         {root vegetables}
                                    => {other vegetables} 0.04738180
                                                                      0.4347015 0.10899847 2.246605
## [25]
         {butter,
          other vegetables}
                                    => {whole milk}
                                                          0.01148958
                                                                      0.5736041 0.02003050 2.244885
##
                                                                                                      1
        {cream cheese}
                                                          ## [26]
                                    => {yogurt}
                                                                                                      1
```

```
## [27]
        {root vegetables,
##
          tropical fruit}
                                   => {whole milk}
                                                         0.01199797 0.5700483 0.02104728 2.230969
                                                                                                     1
## [28]
         {citrus fruit,
          whole milk}
                                   => {other vegetables} 0.01301474  0.4266667  0.03050330  2.205080
                                                                                                     1
##
## [29]
        {root vegetables,
                                                         0.01453991 0.5629921 0.02582613 2.203354
                                   => {whole milk}
##
         yogurt}
## [30]
         {tropical fruit,
##
          yogurt}
                                    => {other vegetables} 0.01230300
                                                                     0.4201389 0.02928317 2.171343
                                                                                                     1
         {domestic eggs,
## [31]
##
          other vegetables}
                                   => {whole milk}
                                                         0.01230300
                                                                     0.5525114 0.02226741 2.162336
                                                                                                     1
## [32]
         {chicken}
                                   => {other vegetables} 0.01789527
                                                                     0.4170616 0.04290798 2.155439
                                                                                                     1
## [33]
         {butter,
##
         whole milk}
                                   => {other vegetables} 0.01148958
                                                                     0.4169742 0.02755465 2.154987
                                                                                                     1
                                                                     0.4159021 0.03324860 2.149447
## [34]
         {hamburger meat}
                                   => {other vegetables} 0.01382816
## [35]
         {domestic eggs,
##
          whole milk}
                                   => {other vegetables} 0.01230300
                                                                     0.4101695 0.02999492 2.119820
                                                                                                     1
## [36]
         {tropical fruit,
##
          whole milk}
                                   => {other vegetables} 0.01708185
                                                                     0.4038462 0.04229792 2.087140
                                                                                                     1
                                   => {other vegetables} 0.02887646
                                                                     0.4028369 \ 0.07168277 \ 2.081924
## [37]
         {whipped/sour cream}
                                                                                                     2
##
   [38]
         {whole milk,
##
          yogurt}
                                    => {other vegetables} 0.02226741
                                                                     0.3974592 0.05602440 2.054131
                                                                                                     2
## [39]
         {whipped/sour cream,
          yogurt}
                                    => {whole milk}
                                                         0.01087951 0.5245098 0.02074225 2.052747
##
                                                                                                     1
## [40]
         {rolls/buns,
                                                         0.01270971 0.5230126 0.02430097 2.046888
##
          root vegetables}
                                   => {whole milk}
                                                                                                     1
## [41]
         {fruit/vegetable juice,
##
          whole milk}
                                   => {other vegetables} 0.01047280
                                                                     0.3931298 0.02663955 2.031756
                                                                                                     1
## [42]
        {other vegetables,
                                   => {whole milk}
                                                         ##
         pip fruit}
## [43]
         {tropical fruit,
##
          yogurt}
                                   => {whole milk}
                                                         1
## [44]
         {other vegetables,
                                                                                                     2
##
         yogurt}
                                   => {whole milk}
                                                         0.02226741
                                                                     0.5128806 0.04341637 2.007235
## [45]
         {other vegetables,
          whipped/sour cream}
                                   => {whole milk}
                                                         0.01464159
                                                                     0.5070423 0.02887646 1.984385
##
## [46]
         {fruit/vegetable juice,
##
          other vegetables}
                                    => {whole milk}
                                                         0.01047280 0.4975845 0.02104728 1.947371
## [47]
         {butter}
                                    => {whole milk}
                                                         0.02755465
                                                                     0.4972477 0.05541434 1.946053
                                                                                                     2
## [48]
         {beef}
                                    => {other vegetables} 0.01972547
                                                                     0.3759690 0.05246568 1.943066
                                                                                                     1
## [49]
         {pork}
                                    => {other vegetables} 0.02165735
                                                                     0.3756614 0.05765125 1.941476
                                                                                                     2
         {curd}
                                    => {whole milk}
                                                                     0.4904580 0.05327911 1.919481
                                                                                                     2
## [50]
                                                         0.02613116
## [51]
         {butter milk}
                                    => {other vegetables} 0.01037112
                                                                     0.3709091 0.02796136 1.916916
                                                                                                     1
## [52]
        {other vegetables,
                                                                                                     2
##
         root vegetables}
                                   => {whole milk}
                                                         0.02318251
                                                                     0.4892704 0.04738180 1.914833
                                                                     0.3699789 0.04809354 1.912108
## [53]
         {frozen vegetables}
                                    => {other vegetables} 0.01779359
## [54]
         {butter}
                                   => {other vegetables} 0.02003050
                                                                     0.3614679 0.05541434 1.868122
                                                                                                     1
## [55]
         {other vegetables,
                                   => {whole milk}
                                                         0.01708185
##
          tropical fruit}
                                                                     0.4759207 0.03589222 1.862587
                                                                                                     1
## [56]
         {citrus fruit,
                                                                                                     1
##
         yogurt}
                                   => {whole milk}
                                                         0.01026945
                                                                     0.4741784 0.02165735 1.855768
                                                                     0.4727564 0.06344687 1.850203
                                                                                                     2
## [57]
         {domestic eggs}
                                   => {whole milk}
                                                         0.02999492
## [58]
         {other vegetables,
##
         pork}
                                   => {whole milk}
                                                         1
## [59]
         {other vegetables,
```

```
##
         pastry}
                                  => {whole milk}
                                                       1
        {domestic eggs}
## [60]
                                  => {other vegetables} 0.02226741
                                                                  0.3509615 0.06344687 1.813824
                                                                                                 2
## [61]
        {citrus fruit}
                                                                  0.3488943 0.08276563 1.803140
                                  => {other vegetables} 0.02887646
                                                                                                 2
## [62]
        {soda,
         whole milk}
                                  => {other vegetables} 0.01392984
                                                                  0.3477157 0.04006101 1.797049
## [63]
        {cream cheese}
                                  => {other vegetables} 0.01372649
                                                                  0.3461538 0.03965430 1.788977
## [64]
        {pip fruit}
                                  => {other vegetables} 0.02613116
                                                                  0.3454301 0.07564820 1.785237
                                  => {rolls/buns}
## [65]
        {frankfurter}
                                                       0.01921708
                                                                  0.3258621 0.05897306 1.771616
## [66]
        {rolls/buns,
##
                                  => {whole milk}
                                                       0.01555669
                                                                  0.4526627 0.03436706 1.771563
         yogurt}
                                                                                                 1
## [67]
        {sausage}
                                  => {rolls/buns}
                                                       0.03060498
                                                                  0.3257576 0.09395018 1.771048
                                                                                                 3
## [68]
        {tropical fruit}
                                  => {other vegetables} 0.03589222
                                                                  0.3420543 0.10493137 1.767790
## [69]
        {citrus fruit,
         other vegetables}
                                  => {whole milk}
                                                                  0.4507042 0.02887646 1.763898
##
                                                       0.01301474
## [70]
        {whipped/sour cream}
                                  => {whole milk}
                                                       0.03223183
                                                                  0.4496454 0.07168277 1.759754
## [71]
        {sausage,
##
         whole milk}
                                  => {other vegetables} 0.01016777
                                                                  0.3401361 0.02989324 1.757876
## [72]
        {root vegetables}
                                  => {whole milk}
                                                       0.04890696
                                                                  0.4486940 0.10899847 1.756031
## [73]
        {rolls/buns,
         tropical fruit}
                                  => {whole milk}
##
                                                       0.01098119
                                                                  0.4462810 0.02460600 1.746587
## [74]
        {margarine}
                                  => {other vegetables} 0.01972547
                                                                  0.3368056 0.05856634 1.740663
## [75]
        {sugar}
                                  => {whole milk}
                                                       0.01504830
                                                                  0.4444444 0.03385867 1.739400
                                  => {whole milk}
                                                       ## [76]
        {hamburger meat}
## [77]
        {rolls/buns,
##
         yogurt}
                                  => {other vegetables} 0.01148958 0.3343195 0.03436706 1.727815
                                                                                                 1
                                                                  0.4414062 0.02602949 1.727509
## [78]
        {ham}
                                  => {whole milk}
                                                       0.01148958
## [79]
        {sliced cheese}
                                  => {whole milk}
                                                       0.01077783
                                                                  0.4398340 0.02450432 1.721356
                                                                                                 1
## [80]
        {bottled water,
                                  => {whole milk}
##
         other vegetables}
                                                       ## [81]
        {white bread}
                                  => {other vegetables} 0.01372649
                                                                  0.3260870 0.04209456 1.685268
## [82]
        {curd}
                                  => {other vegetables} 0.01718353
                                                                  0.3225191 0.05327911 1.666829
## [83]
        {other vegetables,
                                  => {whole milk}
##
         soda}
                                                       0.01392984
                                                                  0.4254658 0.03274021 1.665124
## [84]
        {frozen vegetables}
                                  => {whole milk}
                                                       0.02043721
                                                                  0.4249471 0.04809354 1.663094
                                                                                                 2
## [85]
        {sugar}
                                  => {other vegetables} 0.01077783
                                                                  0.3183183 0.03385867 1.645119
##
  [86]
        {other vegetables,
##
         rolls/buns}
                                  => {whole milk}
                                                       0.01789527
                                                                  0.4200477 0.04260295 1.643919
## [87]
        {pastry,
##
         whole milk}
                                  => {other vegetables} 0.01057448  0.3180428 0.03324860 1.643695
## [88]
        {rolls/buns,
                                                                  0.3159785 0.05663447 1.633026
##
         whole milk}
                                  => {other vegetables} 0.01789527
## [89]
                                                                  0.4153846 0.03965430 1.625670
        {cream cheese}
                                  => {whole milk}
                                                       0.01647178
                                                                                                 1
## [90]
        {butter milk}
                                  => {whole milk}
                                                       ## [91]
        {bottled water,
##
                                  => {other vegetables} 0.01077783
                                                                  0.3136095 0.03436706 1.620783
         whole milk}
## [92]
                                  => {whole milk}
        {margarine}
                                                       0.02419929
                                                                  0.4131944 0.05856634 1.617098
## [93]
                                  => {other vegetables} 0.01159126
        {dessert}
                                                                  0.3123288 0.03711235 1.614164
                                                                                                 1
## [94]
        {yogurt}
                                  => {other vegetables} 0.04341637
                                                                  0.3112245 0.13950178 1.608457
## [95]
        {hard cheese}
                                  => {whole milk}
                                                       0.01006609
                                                                  0.4107884 0.02450432 1.607682
## [96]
        {chicken}
                                  => {whole milk}
                                                       0.01759024
                                                                  0.4099526 0.04290798 1.604411
## [97]
        {berries}
                                  => {other vegetables} 0.01026945
                                                                  0.3088685 0.03324860 1.596280
## [98]
        {white bread}
                                  => {whole milk}
                                                       ## [99]
        {beef}
                                  => {whole milk}
                                                       ## [100] {tropical fruit}
                                  => {whole milk}
                                                       0.04229792  0.4031008  0.10493137  1.577595
```

```
## [101] {oil}
                            => {whole milk}
                                             1
## [102] {yogurt}
                           => {whole milk}
                                             5
## [103] {pip fruit}
                           => {whole milk}
                                             0.03009659 0.3978495 0.07564820 1.557043
                                                                                2
## [104] {onions}
                            => {whole milk}
                                             0.01209964
                                                      0.3901639 0.03101169 1.526965
## [105] {hygiene articles}
                            => {whole milk}
                                             0.01281139
                                                      0.3888889 0.03294357 1.521975
## [106] {brown bread}
                            => {whole milk}
                                             ## [107] {other vegetables}
                            => {whole milk}
                                             ## [108] {pork}
                            => {whole milk}
                                             2
## [109] {soda,
                            => {whole milk}
                                             0.01047280 0.3828996 0.02735130 1.498535
##
       yogurt}
                                                                                1
## [110] {other vegetables,
                            => {whole milk}
                                             0.01016777
                                                      0.3773585 0.02694459 1.476849
                                                                                1
##
       sausage}
## [111] {napkins}
                            => {whole milk}
                                             0.01972547
                                                      0.3766990 0.05236401 1.474268
                                                                                1
## [112] {pastry}
                            => {whole milk}
                                             0.03324860 0.3737143 0.08896797 1.462587
## [113] {dessert}
                            => {whole milk}
                                             0.01372649
                                                      0.3698630 0.03711235 1.447514
## [114] {citrus fruit}
                            => {whole milk}
                                             0.03050330
                                                      0.3685504 0.08276563 1.442377
                                                                                3
## [115] {fruit/vegetable juice}
                                                                                2
                            => {whole milk}
                                             0.02663955
                                                      0.3684951 0.07229283 1.442160
## [116] {long life bakery product} => {whole milk}
                                             0.01352313
                                                      0.3614130 0.03741739 1.414444
                                                                                1
## [117] {berries}
                            => {whole milk}
                                             0.01179461 0.3547401 0.03324860 1.388328
## [118] {frankfurter}
                            => {whole milk}
                                             ## [119] {newspapers}
                            => {whole milk}
                                             2
## [120] {chocolate}
                            => {whole milk}
                                             ## [121] {waffles}
                            => {whole milk}
                                             0.01270971 0.3306878 0.03843416 1.294196
                                                                                1
## [122] {coffee}
                            => {whole milk}
                                             0.01870869 0.3222417 0.05805796 1.261141
                                                                                1
## [123] {sausage}
                           => {whole milk}
                                             2
## [124] {bottled water}
                            => {whole milk}
                                             3
## [125] {rolls/buns}
                            => {whole milk}
                                             5
```

Lihat aturan dengan tertib keyakinan menurun

```
##
       lhs
                                                   support confidence
                                                                                lift cou
                                 rhs
                                                                     coverage
## [1]
       {citrus fruit,
        root vegetables}
                              => {other vegetables} 0.01037112  0.5862069 0.01769192 3.029608
                                                                                      1
##
## [2]
       {root vegetables,
##
        tropical fruit}
                              => {other vegetables} 0.01230300  0.5845411  0.02104728  3.020999
## [3]
       {curd,
                                                 0.01006609 \quad 0.5823529 \ 0.01728521 \ 2.279125
                              => {whole milk}
##
        yogurt}
## [4]
       {butter,
##
        other vegetables}
                              => {whole milk}
                                                 ## [5]
       {root vegetables,
##
        tropical fruit}
                              => {whole milk}
                                                 ## [6]
       {root vegetables,
##
                              => {whole milk}
                                                 yogurt}
## [7]
       {domestic eggs,
##
        other vegetables}
                              => {whole milk}
                                                 ## [8]
       {whipped/sour cream,
##
                              => {whole milk}
                                                 0.01087951 0.5245098 0.02074225 2.052747
                                                                                      1
        yogurt}
## [9]
       {rolls/buns,
```

```
root vegetables}
                                 => {whole milk}
                                                      0.01270971 0.5230126 0.02430097 2.046888
##
        {other vegetables,
## [10]
                                 => {whole milk}
##
         pip fruit}
                                                      1
        {tropical fruit,
## [11]
##
         yogurt}
                                 => {whole milk}
                                                      {other vegetables,
## [12]
                                 => {whole milk}
                                                      0.02226741 0.5128806 0.04341637 2.007235
##
         yogurt}
## [13]
        {other vegetables,
         whipped/sour cream}
##
                                 => {whole milk}
                                                      0.01464159 0.5070423 0.02887646 1.984385
## [14]
        {rolls/buns,
         root vegetables}
                                 => {other vegetables} 0.01220132 0.5020921 0.02430097 2.594890
                                                                                               1
        {root vegetables,
## [15]
##
         yogurt}
                                 => {other vegetables} 0.01291307
                                                                 0.5000000 0.02582613 2.584078
## [16]
        {fruit/vegetable juice,
##
         other vegetables}
                                 => {whole milk}
                                                      0.01047280
                                                                 0.4975845 0.02104728 1.947371
                                                                                               1
## [17]
        {butter}
                                 => {whole milk}
                                                      0.02755465
                                                                 0.4972477 0.05541434 1.946053
                                                                                               2
## [18]
        {curd}
                                 => {whole milk}
                                                      0.02613116
                                                                                               2
                                                                 0.4904580 0.05327911 1.919481
##
  [19]
        {whipped/sour cream,
                                 => {other vegetables} 0.01016777
                                                                 0.4901961 0.02074225 2.533410
##
         yogurt}
                                                                                               1
## [20]
        {other vegetables,
##
         root vegetables}
                                 => {whole milk}
                                                      2
## [21]
        {other vegetables,
         tropical fruit}
                                 => {whole milk}
                                                      ##
## [22]
        {citrus fruit,
                                                      ##
         yogurt}
                                 => {whole milk}
                                                                                               1
## [23]
        {root vegetables,
##
         whole milk}
                                 => {other vegetables} 0.02318251
                                                                 0.4740125 0.04890696 2.449770
                                                                                               2
                                 => {whole milk}
                                                                 0.4727564 0.06344687 1.850203
## [24]
        {domestic eggs}
                                                      0.02999492
                                                                                               2
## [25]
        {other vegetables,
         pork}
                                 => {whole milk}
##
                                                      0.01016777
                                                                 0.4694836 0.02165735 1.837394
                                                                                               1
## [26]
        {other vegetables,
##
         pastry}
                                 => {whole milk}
                                                      0.01057448
                                                                 0.4684685 0.02257245 1.833421
                                                                                               1
## [27]
        {onions}
                                 => {other vegetables} 0.01423488
                                                                 0.4590164 0.03101169 2.372268
  [28]
        {pork,
##
##
         whole milk}
                                 => {other vegetables} 0.01016777
                                                                 0.4587156 0.02216573 2.370714
## [29]
        {whipped/sour cream,
##
         whole milk}
                                 => {other vegetables} 0.01464159
                                                                 0.4542587 0.03223183 2.347679
## [30]
        {rolls/buns,
         yogurt}
                                 => {whole milk}
                                                      0.01555669
                                                                 0.4526627 0.03436706 1.771563
##
## [31]
        {citrus fruit,
         other vegetables}
                                 => {whole milk}
                                                      0.01301474
                                                                 0.4507042 0.02887646 1.763898
                                                                                               1
## [32]
        {whipped/sour cream}
                                 => {whole milk}
                                                      3
## [33]
        {pip fruit,
##
         whole milk}
                                 => {other vegetables} 0.01352313
                                                                 0.4493243 0.03009659 2.322178
                                                                                               1
## [34]
        {root vegetables}
                                 => {whole milk}
                                                      0.04890696
                                                                 0.4486940 0.10899847 1.756031
## [35]
        {rolls/buns,
                                 => {whole milk}
##
         tropical fruit}
                                                      0.01098119
                                                                 0.4462810 0.02460600 1.746587
                                                                                               1
## [36]
        {sugar}
                                 => {whole milk}
                                                      0.01504830
                                                                 0.4444444 0.03385867 1.739400
                                                                                               1
## [37]
        {hamburger meat}
                                 => {whole milk}
                                                      0.01474326
                                                                 0.4434251 0.03324860 1.735410
                                                                                               1
## [38]
        {ham}
                                 => {whole milk}
                                                      0.01148958
                                                                 0.4414062 0.02602949 1.727509
## [39]
        {sliced cheese}
                                 => {whole milk}
                                                      0.01077783
                                                                 0.4398340 0.02450432 1.721356
## [40]
        {root vegetables}
                                 => {other vegetables} 0.04738180 0.4347015 0.10899847 2.246605
## [41]
        {bottled water,
##
         other vegetables}
                                 => {whole milk}
```

```
## [42]
        {citrus fruit,
##
                                   => {other vegetables} 0.01301474  0.4266667  0.03050330  2.205080
          whole milk}
                                                                                                     1
## [43]
         {other vegetables,
##
          soda}
                                    => {whole milk}
                                                         0.01392984
                                                                     0.4254658 0.03274021 1.665124
                                                                                                     1
## [44]
        {frozen vegetables}
                                    => {whole milk}
                                                         0.02043721
                                                                     0.4249471 0.04809354 1.663094
## [45]
        {tropical fruit,
                                    => {other vegetables} 0.01230300 0.4201389 0.02928317 2.171343
##
         yogurt}
## [46]
         {other vegetables,
##
          rolls/buns}
                                   => {whole milk}
                                                         0.01789527
                                                                     0.4200477 0.04260295 1.643919
                                                                                                     1
## [47]
         {chicken}
                                   => {other vegetables} 0.01789527
                                                                     0.4170616 0.04290798 2.155439
                                                                                                     1
## [48]
        {butter,
##
                                   => {other vegetables} 0.01148958
                                                                                                     1
         whole milk}
                                                                     0.4169742 0.02755465 2.154987
## [49]
         {hamburger meat}
                                   => {other vegetables} 0.01382816
                                                                     0.4159021 0.03324860 2.149447
                                                                                                     1
## [50]
                                   => {whole milk}
         {cream cheese}
                                                         ## [51]
         {butter milk}
                                   => {whole milk}
                                                         0.01159126
                                                                     0.4145455 0.02796136 1.622385
## [52]
         {margarine}
                                   => {whole milk}
                                                         0.02419929
                                                                     0.4131944 0.05856634 1.617098
## [53]
         {hard cheese}
                                   => {whole milk}
                                                         0.01006609
                                                                     0.4107884 0.02450432 1.607682
         {domestic eggs,
## [54]
         whole milk}
                                   => {other vegetables} 0.01230300
##
                                                                     0.4101695 0.02999492 2.119820
                                                                                                     1
## [55]
         {chicken}
                                   => {whole milk}
                                                         0.01759024
                                                                     0.4099526 0.04290798 1.604411
## [56]
        {white bread}
                                   => {whole milk}
                                                         0.01708185
                                                                     0.4057971 0.04209456 1.588147
## [57]
         {beef}
                                    => {whole milk}
                                                         0.02125064
                                                                     0.4050388 0.05246568 1.585180
## [58]
        {tropical fruit,
         whole milk}
                                    => {other vegetables} 0.01708185
##
                                                                     0.4038462 0.04229792 2.087140
                                                                                                     1
                                   => {whole milk}
## [59]
        {tropical fruit}
                                                         0.04229792  0.4031008  0.10493137  1.577595
                                                                                                     4
## [60]
        {whipped/sour cream}
                                   => {other vegetables} 0.02887646
                                                                     0.4028369 0.07168277 2.081924
                                                                                                     2
## [61]
         {oil}
                                   => {whole milk}
                                                         0.01128622
                                                                     0.4021739 0.02806304 1.573968
                                                                                                     1
## [62]
        {yogurt}
                                   => {whole milk}
                                                         0.05602440
                                                                     0.4016035 0.13950178 1.571735
## [63]
                                   => {whole milk}
                                                         0.03009659
                                                                     0.3978495 0.07564820 1.557043
         {pip fruit}
## [64]
        {whole milk,
##
          yogurt}
                                   => {other vegetables} 0.02226741 0.3974592 0.05602440 2.054131
## [65]
         {fruit/vegetable juice,
##
          whole milk}
                                   => {other vegetables} 0.01047280
                                                                     0.3931298 0.02663955 2.031756
## [66]
         {onions}
                                   => {whole milk}
                                                         0.01209964
                                                                     0.3901639 0.03101169 1.526965
                                                                                                     1
## [67]
         {hygiene articles}
                                   => {whole milk}
                                                         0.01281139
                                                                     0.3888889 0.03294357 1.521975
                                                                                                     1
## [68]
        {brown bread}
                                   => {whole milk}
                                                         0.02521607
                                                                     0.3887147 0.06487036 1.521293
## [69]
         {other vegetables}
                                    => {whole milk}
                                                         0.07483477
                                                                     0.3867578 0.19349263 1.513634
## [70]
        {curd,
##
          whole milk}
                                    => {yogurt}
                                                         0.01006609
                                                                     0.3852140 0.02613116 2.761356
## [71]
         {pork}
                                   => {whole milk}
                                                         ## [72]
        {soda,
                                   => {whole milk}
                                                         0.01047280 0.3828996 0.02735130 1.498535
                                                                                                     1
##
         yogurt}
## [73]
         {other vegetables,
                                   => {whole milk}
##
         sausage}
                                                         0.01016777
                                                                     0.3773585 0.02694459 1.476849
                                                                                                     1
## [74]
         {napkins}
                                   => {whole milk}
                                                         0.01972547
                                                                     0.3766990 0.05236401 1.474268
                                                                                                     1
## [75]
         {beef}
                                   => {other vegetables} 0.01972547
                                                                     0.3759690 0.05246568 1.943066
                                                                                                     1
## [76]
        {pork}
                                   => {other vegetables} 0.02165735
                                                                     0.3756614 0.05765125 1.941476
                                                                                                     2
## [77]
                                   => {whole milk}
         {pastry}
                                                         0.03324860
                                                                     0.3737143 0.08896797 1.462587
## [78]
         {butter milk}
                                   => {other vegetables} 0.01037112
                                                                     0.3709091 0.02796136 1.916916
                                                                                                     1
## [79]
        {frozen vegetables}
                                   => {other vegetables} 0.01779359
                                                                     0.3699789 0.04809354 1.912108
## [80]
        {dessert}
                                   => {whole milk}
                                                         0.01372649
                                                                     0.3698630 0.03711235 1.447514
                                                                                                     1
## [81]
        {citrus fruit}
                                    => {whole milk}
                                                         ## [82]
         {fruit/vegetable juice}
                                   => {whole milk}
                                                         0.02663955
                                                                     0.3684951 0.07229283 1.442160
## [83]
        {butter}
                                    => {other vegetables} 0.02003050 0.3614679 0.05541434 1.868122
```

2

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3

```
{long life bakery product} => {whole milk}
                                                      ## [85]
        {citrus fruit,
##
         other vegetables}
                                 => {root vegetables} 0.01037112 0.3591549 0.02887646 3.295045
## [86]
        {tropical fruit,
##
         whole milk}
                                 => {yogurt}
                                                      1
## [87]
        {berries}
                                 => {whole milk}
                                                      0.01179461 0.3547401 0.03324860 1.388328
## [88]
        {other vegetables,
         whipped/sour cream}
                                 => {yogurt}
##
                                                      ## [89]
        {domestic eggs}
                                 => {other vegetables} 0.02226741
                                                                 0.3509615 0.06344687 1.813824
                                                                                               2
## [90]
                                 => {other vegetables} 0.02887646
        {citrus fruit}
                                                                 0.3488943 0.08276563 1.803140
                                                                                               2
## [91]
        {frankfurter}
                                 => {whole milk}
                                                      0.02053889
                                                                 0.3482759 0.05897306 1.363029
                                                                                               2
## [92]
       {soda,
##
         whole milk}
                                 => {other vegetables} 0.01392984
                                                                 0.3477157 0.04006101 1.797049
## [93]
                                 => {other vegetables} 0.01372649
        {cream cheese}
                                                                 0.3461538 0.03965430 1.788977
## [94]
                                 => {other vegetables} 0.02613116  0.3454301  0.07564820  1.785237
        {pip fruit}
## [95]
        {other vegetables,
##
         tropical fruit}
                                 => {root vegetables} 0.01230300 0.3427762 0.03589222 3.144780
                                                                                               1
## [96]
        {other vegetables,
         tropical fruit}
                                 => {yogurt}
                                                                 0.3427762 0.03589222 2.457146
##
                                                      0.01230300
                                                                                               1
## [97]
        {newspapers}
                                 => {whole milk}
                                                      0.02735130
                                                                 0.3426752 0.07981698 1.341110
## [98]
       {tropical fruit}
                                 => {other vegetables} 0.03589222 0.3420543 0.10493137 1.767790
## [99]
       {sausage,
         whole milk}
                                 => {other vegetables} 0.01016777 0.3401361 0.02989324 1.757876
##
## [100] {whipped/sour cream,
         whole milk}
##
                                 => {yogurt}
                                                      0.01087951 0.3375394 0.03223183 2.419607
                                                                                               1
## [101] {margarine}
                                 => {other vegetables} 0.01972547
                                                                 0.3368056 0.05856634 1.740663
                                                                                               1
## [102] {citrus fruit,
                                 => {yogurt}
                                                      0.01026945
                                                                 0.3366667 0.03050330 2.413350
         whole milk}
                                                                                               1
## [103] {chocolate}
                                 => {whole milk}
                                                      ## [104] {rolls/buns,
##
         yogurt}
                                 => {other vegetables} 0.01148958 0.3343195 0.03436706 1.727815
## [105] {beef}
                                 => {root vegetables} 0.01738688
                                                                 0.3313953 0.05246568 3.040367
                                                                                               1
                                 => {whole milk}
## [106] {waffles}
                                                      0.01270971
                                                                 0.3306878 0.03843416 1.294196
                                                                                               1
                                 => {other vegetables} 0.01372649
## [107] {white bread}
                                                                 0.3260870 0.04209456 1.685268
                                                                                               1
## [108] {frankfurter}
                                 => {rolls/buns}
                                                      0.01921708
                                                                 0.3258621 0.05897306 1.771616
                                 => {rolls/buns}
## [109] {sausage}
                                                      ## [110] {curd}
                                 => {yogurt}
                                                      0.01728521  0.3244275  0.05327911  2.325615
## [111] {curd}
                                 => {other vegetables} 0.01718353 0.3225191 0.05327911 1.666829
## [112] {coffee}
                                 => {whole milk}
                                                      0.01870869 0.3222417 0.05805796 1.261141
                                                                                               1
## [113] {sugar}
                                 => {other vegetables} 0.01077783 0.3183183 0.03385867 1.645119
                                                                                               1
## [114] {sausage}
                                 => {whole milk}
                                                                 0.3181818 0.09395018 1.245252
                                                                                               2
                                                      0.02989324
## [115] {berries}
                                 => {yogurt}
                                                      1
## [116] {pastry,
                                 => {other vegetables} 0.01057448  0.3180428 0.03324860 1.643695
##
         whole milk}
## [117] {rolls/buns,
         whole milk}
                                 => {other vegetables} 0.01789527 0.3159785 0.05663447 1.633026
                                                                                               1
##
## [118] {bottled water,
         whole milk}
                                 => {other vegetables} 0.01077783 0.3136095 0.03436706 1.620783
                                                                                               1
## [119] {cream cheese}
                                 => {yogurt}
                                                      0.01240468
                                                                 0.3128205 0.03965430 2.242412
                                                                                               1
## [120] {dessert}
                                 => {other vegetables} 0.01159126
                                                                 0.3123288 0.03711235 1.614164
                                 => {other vegetables} 0.04341637
## [121] {yogurt}
                                                                 0.3112245 0.13950178 1.608457
                                 => {whole milk}
## [122] {bottled water}
                                                      ## [123] {other vegetables,
                                 => {root vegetables} 0.02318251 0.3097826 0.07483477 2.842082
                                                                                               2
##
         whole milk}
```

```
## [124] {berries}
                                    => {other vegetables} 0.01026945 0.3088685 0.03324860 1.596280
                                    => {whole milk}
## [125] {rolls/buns}
                                                          0.05663447
                                                                      0.3079049 0.18393493 1.205032
```

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1

Lihat aturan dengan tertib support menurun

```
Aturan.S4 = sort(Aturan.S1, by='support',
                 decreasing = T)
inspect(Aturan.S4)
```

```
##
        lhs
                                    rhs
                                                         support confidence
                                                                                         lift cou
                                                                             coverage
## [1]
        {other vegetables}
                                 => {whole milk}
                                                      0.07483477
                                                                  0.3867578 0.19349263 1.513634
## [2]
        {rolls/buns}
                                 => {whole milk}
                                                      0.05663447
                                                                  0.3079049 0.18393493 1.205032
## [3]
        {yogurt}
                                                      0.05602440
                                                                  0.4016035 0.13950178 1.571735
                                 => {whole milk}
  [4]
        {root vegetables}
                                 => {whole milk}
                                                      0.04890696
                                                                 0.4486940 0.10899847 1.756031
##
  [5]
        {root vegetables}
##
                                 => {other vegetables} 0.04738180
                                                                 0.4347015 0.10899847 2.246605
## [6]
        {yogurt}
                                 => {other vegetables} 0.04341637 0.3112245 0.13950178 1.608457
## [7]
        {tropical fruit}
                                 => {whole milk}
                                                      0.04229792  0.4031008  0.10493137  1.577595
## [8]
        {tropical fruit}
                                 => {other vegetables} 0.03589222
                                                                 0.3420543 0.10493137 1.767790
## [9]
        {bottled water}
                                 => {whole milk}
                                                      0.03436706
                                                                 0.3109476 0.11052364 1.216940
## [10]
        {pastry}
                                 => {whole milk}
                                                      0.03324860 0.3737143 0.08896797 1.462587
## [11]
        {whipped/sour cream}
                                                      => {whole milk}
## [12]
        {sausage}
                                 => {rolls/buns}
                                                      ## [13]
        {citrus fruit}
                                 => {whole milk}
                                                      ## [14]
        {pip fruit}
                                 => {whole milk}
                                                      0.03009659 0.3978495 0.07564820 1.557043
## [15]
        {domestic eggs}
                                 => {whole milk}
                                                      ## [16]
        {sausage}
                                 => {whole milk}
                                                      0.02989324
                                                                  0.3181818 0.09395018 1.245252
## [17]
        {whipped/sour cream}
                                 => {other vegetables} 0.02887646
                                                                  0.4028369 \ 0.07168277 \ 2.081924
## [18]
        {citrus fruit}
                                 => {other vegetables} 0.02887646
                                                                  0.3488943 0.08276563 1.803140
## [19]
                                 => {whole milk}
                                                                 0.4972477 0.05541434 1.946053
        {butter}
                                                      0.02755465
## [20]
        {newspapers}
                                 => {whole milk}
                                                      0.02735130
                                                                 0.3426752 0.07981698 1.341110
## [21]
        {fruit/vegetable juice}
                                 => {whole milk}
                                                      ## [22]
                                                                 0.4904580 0.05327911 1.919481
        {curd}
                                  => {whole milk}
                                                      0.02613116
## [23]
        {pip fruit}
                                 => {other vegetables} 0.02613116
                                                                 0.3454301 0.07564820 1.785237
## [24]
        {brown bread}
                                  => {whole milk}
                                                      0.02521607
                                                                  0.3887147 0.06487036 1.521293
                                 => {whole milk}
                                                                 0.4131944 0.05856634 1.617098
## [25]
        {margarine}
                                                      0.02419929
  [26]
        {other vegetables,
                                                      ##
         root vegetables}
                                 => {whole milk}
## [27]
        {root vegetables,
##
         whole milk}
                                 => {other vegetables} 0.02318251
                                                                 0.4740125 0.04890696 2.449770
## [28]
        {other vegetables,
##
         whole milk}
                                 => {root vegetables} 0.02318251
                                                                 0.3097826 0.07483477 2.842082
## [29]
                                 => {other vegetables} 0.02226741
                                                                 0.3509615 0.06344687 1.813824
        {domestic eggs}
##
  [30]
        {other vegetables,
                                                                 0.5128806 0.04341637 2.007235
##
         yogurt}
                                 => {whole milk}
                                                      0.02226741
##
  [31]
        {whole milk,
##
         yogurt}
                                 => {other vegetables} 0.02226741 0.3974592 0.05602440 2.054131
## [32]
                                                      0.02216573
                                                                  0.3844797 0.05765125 1.504719
        {pork}
                                 => {whole milk}
## [33]
                                                                 0.3756614 0.05765125 1.941476
        {pork}
                                 => {other vegetables} 0.02165735
## [34]
        {beef}
                                                      0.02125064
                                                                  0.4050388 0.05246568 1.585180
                                  => {whole milk}
## [35]
        {frankfurter}
                                 => {whole milk}
                                                      0.02053889
                                                                 0.3482759 0.05897306 1.363029
## [36]
        {frozen vegetables}
                                 => {whole milk}
                                                      0.02043721
                                                                 0.4249471 0.04809354 1.663094
## [37]
        {butter}
                                 => {other vegetables} 0.02003050 0.3614679 0.05541434 1.868122
```

```
## [38]
        {beef}
                                 => {other vegetables} 0.01972547 0.3759690 0.05246568 1.943066
                                                                                               1
## [39]
        {napkins}
                                 => {whole milk}
                                                      0.01972547
                                                                 0.3766990 0.05236401 1.474268
                                                                                               1
## [40]
        {margarine}
                                 => {other vegetables} 0.01972547
                                                                 0.3368056 0.05856634 1.740663
                                                                                               1
## [41]
        {frankfurter}
                                 => {rolls/buns}
                                                      0.01921708
                                                                0.3258621 0.05897306 1.771616
                                                                                               1
## [42]
        {coffee}
                                 => {whole milk}
                                                      0.01870869
                                                                 0.3222417 0.05805796 1.261141
## [43]
        {chicken}
                                 => {other vegetables} 0.01789527 0.4170616 0.04290798 2.155439
## [44]
        {other vegetables,
         rolls/buns}
                                 => {whole milk}
                                                      ##
                                                                                               1
## [45]
        {rolls/buns,
##
         whole milk}
                                 => {other vegetables} 0.01789527
                                                                 0.3159785 0.05663447 1.633026
                                                                                               1
## [46]
        {frozen vegetables}
                                 => {other vegetables} 0.01779359
                                                                 0.3699789 0.04809354 1.912108
                                                                                               1
## [47]
        {chicken}
                                 => {whole milk}
                                                      0.01759024
                                                                0.4099526 0.04290798 1.604411
                                                                                               1
        {beef}
## [48]
                                 => {root vegetables}
                                                     0.01738688
                                                                 0.3313953 0.05246568 3.040367
        {curd}
## [49]
                                 => {yogurt}
                                                      0.01728521 \quad 0.3244275 \quad 0.05327911 \quad 2.325615
## [50]
        {curd}
                                 => {other vegetables} 0.01718353
                                                                 0.3225191 0.05327911 1.666829
                                                                                               1
## [51]
        {white bread}
                                 => {whole milk}
                                                      0.01708185
                                                                 0.4057971 0.04209456 1.588147
## [52]
        {other vegetables,
##
         tropical fruit}
                                 => {whole milk}
                                                      0.01708185
                                                                0.4759207 0.03589222 1.862587
                                                                                               1
## [53]
        {tropical fruit,
##
         whole milk}
                                 => {other vegetables} 0.01708185 0.4038462 0.04229792 2.087140
## [54]
        {chocolate}
                                 => {whole milk}
                                                      0.01667514
                                                                0.3360656 0.04961871 1.315243
## [55]
        {cream cheese}
                                 => {whole milk}
                                                      ## [56]
        {rolls/buns,
                                 => {whole milk}
                                                      0.01555669 0.4526627 0.03436706 1.771563
##
         yogurt}
## [57]
        {tropical fruit,
##
         yogurt}
                                 => {whole milk}
                                                      1
## [58]
        {tropical fruit,
         whole milk}
                                 => {yogurt}
                                                      0.01514997
                                                                0.3581731 0.04229792 2.567516
##
                                                                                               1
## [59]
                                 => {whole milk}
                                                                0.4444444 0.03385867 1.739400
        {sugar}
                                                      0.01504830
                                 => {whole milk}
                                                                0.4434251 0.03324860 1.735410
## [60]
        {hamburger meat}
                                                      0.01474326
## [61]
        {other vegetables,
##
         whipped/sour cream}
                                 => {whole milk}
                                                      1
## [62]
        {whipped/sour cream,
         whole milk}
                                 => {other vegetables} 0.01464159
                                                                                               1
##
                                                                0.4542587 0.03223183 2.347679
## [63]
        {root vegetables,
                                 => {whole milk}
                                                      ##
         yogurt}
                                                                                               1
## [64]
        {onions}
                                 => {other vegetables} 0.01423488
                                                                0.4590164 0.03101169 2.372268
## [65]
        {other vegetables,
##
         soda}
                                 => {whole milk}
                                                      ## [66]
        {soda,
##
         whole milk}
                                 => {other vegetables} 0.01392984  0.3477157  0.04006101  1.797049
                                                                                               1
## [67]
        {hamburger meat}
                                 => {other vegetables} 0.01382816
                                                                0.4159021 0.03324860 2.149447
                                                                                               1
## [68]
        {dessert}
                                 => {whole milk}
                                                      0.01372649
                                                                 0.3698630 0.03711235 1.447514
                                                                                               1
## [69]
        {cream cheese}
                                 => {other vegetables} 0.01372649
                                                                                               1
                                                                 0.3461538 0.03965430 1.788977
## [70]
        {white bread}
                                 => {other vegetables} 0.01372649
                                                                 0.3260870 0.04209456 1.685268
                                                                                               1
        {long life bakery product} => {whole milk}
                                                      0.01352313
                                                                0.3614130 0.03741739 1.414444
## [71]
                                                                                               1
## [72]
        {other vegetables,
##
                                 => {whole milk}
                                                      1
         pip fruit}
## [73]
        {pip fruit,
##
         whole milk}
                                 => {other vegetables} 0.01352313  0.4493243 0.03009659 2.322178
## [74]
        {citrus fruit,
                                 => {whole milk}
                                                      ##
         other vegetables}
## [75]
        {citrus fruit,
                                 => {other vegetables} 0.01301474  0.4266667  0.03050330  2.205080
                                                                                               1
##
         whole milk}
```

```
## [76] {root vegetables,
##
                                  => {other vegetables} 0.01291307  0.5000000 0.02582613 2.584078
         yogurt}
                                                                                                1
                                                      0.01281139
## [77]
        {hygiene articles}
                                  => {whole milk}
                                                                 0.3888889 0.03294357 1.521975
                                                                                                1
        {waffles}
                                  => {whole milk}
                                                      0.01270971
                                                                 0.3306878 0.03843416 1.294196
## [78]
                                                                                                1
## [79]
        {rolls/buns,
                                  => {whole milk}
                                                      ##
         root vegetables}
## [80]
        {cream cheese}
                                                      0.01240468  0.3128205  0.03965430  2.242412
                                  => {yogurt}
## [81]
        {domestic eggs,
##
         other vegetables}
                                  => {whole milk}
                                                      1
## [82]
        {domestic eggs,
         whole milk}
                                  => {other vegetables} 0.01230300
                                                                 0.4101695 0.02999492 2.119820
                                                                                                1
## [83]
        {root vegetables,
##
         tropical fruit}
                                  => {other vegetables} 0.01230300
                                                                 0.5845411 0.02104728 3.020999
## [84]
        {other vegetables,
##
                                  => {root vegetables} 0.01230300
         tropical fruit}
                                                                  0.3427762 0.03589222 3.144780
## [85]
        {tropical fruit,
##
         yogurt}
                                  => {other vegetables} 0.01230300
                                                                  0.4201389 0.02928317 2.171343
                                                                                                1
##
  [86]
        {other vegetables,
         tropical fruit}
##
                                  => {yogurt}
                                                      0.01230300
                                                                 0.3427762 0.03589222 2.457146
                                                                                                1
## [87]
        {rolls/buns,
##
         root vegetables}
                                  => {other vegetables} 0.01220132  0.5020921 0.02430097 2.594890
                                                                                                1
## [88]
        {onions}
                                  => {whole milk}
                                                      0.01209964
                                                                 0.3901639 0.03101169 1.526965
        {root vegetables,
## [89]
         tropical fruit}
                                  => {whole milk}
                                                      0.01199797
                                                                 0.5700483 0.02104728 2.230969
##
                                                                                                1
## [90]
        {berries}
                                 => {whole milk}
                                                      0.01179461 0.3547401 0.03324860 1.388328
                                                                                                1
## [91]
        {butter milk}
                                  => {whole milk}
                                                      0.01159126
                                                                 0.4145455 0.02796136 1.622385
                                                                                                1
## [92]
        {dessert}
                                  => {other vegetables} 0.01159126
                                                                 0.3123288 0.03711235 1.614164
                                                                                                1
## [93]
                                  => {whole milk}
                                                                 0.4414062 0.02602949 1.727509
        {ham}
                                                      0.01148958
## [94]
        {butter,
##
         other vegetables}
                                 => {whole milk}
                                                      1
## [95]
        {butter,
##
         whole milk}
                                 => {other vegetables} 0.01148958 0.4169742 0.02755465 2.154987
                                                                                                1
## [96]
        {rolls/buns,
##
                                  => {other vegetables} 0.01148958
                                                                 0.3343195 0.03436706 1.727815
                                                                                                1
         yogurt}
## [97]
        {oil}
                                  => {whole milk}
                                                      0.01128622
                                                                 0.4021739 0.02806304 1.573968
## [98]
        {rolls/buns,
##
         tropical fruit}
                                  => {whole milk}
                                                      ## [99]
        {whipped/sour cream,
                                  => {whole milk}
                                                      0.01087951 0.5245098 0.02074225 2.052747
##
         yogurt}
## [100] {whipped/sour cream,
         whole milk}
                                  => {yogurt}
                                                      0.01087951 0.3375394 0.03223183 2.419607
                                                                                                1
## [101] {sliced cheese}
                                  => {whole milk}
                                                      1
                                  => {other vegetables} 0.01077783 0.3183183 0.03385867 1.645119
## [102] {sugar}
  [103] {bottled water,
##
                                  => {whole milk}
         other vegetables}
                                                      0.01077783
                                                                 0.4344262 0.02480935 1.700192
                                                                                                1
## [104] {bottled water,
##
         whole milk}
                                  => {other vegetables} 0.01077783 0.3136095 0.03436706 1.620783
                                                                                                1
                                  => {yogurt}
                                                                 0.3180428 0.03324860 2.279848
## [105] {berries}
                                                      0.01057448
## [106] {other vegetables,
                                                                                                1
##
         pastry}
                                  => {whole milk}
                                                      ## [107] {pastry,
##
         whole milk}
                                  => {other vegetables} 0.01057448 0.3180428 0.03324860 1.643695
## [108] {fruit/vegetable juice,
##
         other vegetables}
                                  => {whole milk}
                                                      0.01047280 0.4975845 0.02104728 1.947371
                                                                                                1
```

```
## [109] {fruit/vegetable juice,
##
        whole milk}
                               => {other vegetables} 0.01047280 0.3931298 0.02663955 2.031756
## [110] {soda,
                               => {whole milk}
                                                   0.01047280
                                                             0.3828996 0.02735130 1.498535
        yogurt}
##
## [111] {butter milk}
                               => {other vegetables} 0.01037112 0.3709091 0.02796136 1.916916
## [112] {citrus fruit,
        root vegetables}
                               => {other vegetables} 0.01037112  0.5862069 0.01769192 3.029608
## [113] {citrus fruit,
##
        other vegetables}
                               => {root vegetables} 0.01037112 0.3591549 0.02887646 3.295045
## [114] {berries}
                               => {other vegetables} 0.01026945 0.3088685 0.03324860 1.596280
## [115] {citrus fruit,
        yogurt}
                               => {whole milk}
                                                   ##
## [116] {citrus fruit,
        whole milk}
                               => {yogurt}
                                                   ##
## [117] {other vegetables,
##
        pork}
                               => {whole milk}
                                                   ## [118] {pork,
                               => {other vegetables} 0.01016777  0.4587156 0.02216573 2.370714
##
        whole milk}
## [119] {whipped/sour cream,
        yogurt}
                               => {other vegetables} 0.01016777 0.4901961 0.02074225 2.533410
## [120] {other vegetables,
        whipped/sour cream}
                               => {yogurt}
                                                   ## [121] {other vegetables,
                               => {whole milk}
                                                   0.01016777 0.3773585 0.02694459 1.476849
##
        sausage}
## [122] {sausage,
        whole milk}
                               => {other vegetables} 0.01016777
                                                             0.3401361 0.02989324 1.757876
## [123] {hard cheese}
                               => {whole milk}
                                                   0.01006609
                                                             0.4107884 0.02450432 1.607682
## [124] {curd,
                               => {whole milk}
                                                   0.01006609 0.5823529 0.01728521 2.279125
        yogurt}
##
## [125] {curd,
        whole milk}
##
                               => {yogurt}
```

1

1

1

1

1

1

1

1

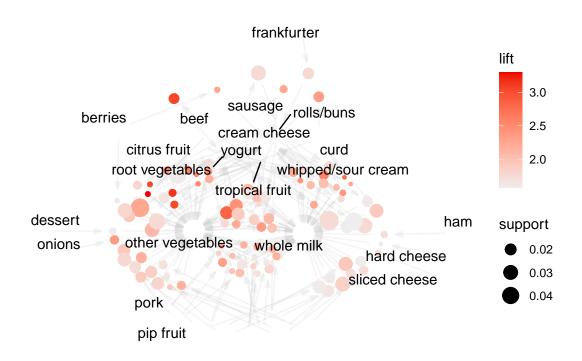
Bagaimana untuk mengvisualkan corak dan pola bagi aturan sekutuan yang signifikan?

Plot rangkaian

```
plot(Aturan.S1, method='graph')

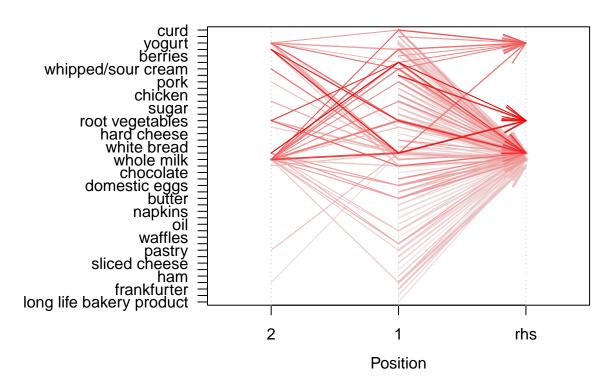
## Warning: Too many rules supplied. Only plotting the best 100 using 'lift'
## (change control parameter max if needed).

## Warning: ggrepel: 13 unlabeled data points (too many overlaps). Consider
## increasing max.overlaps
```



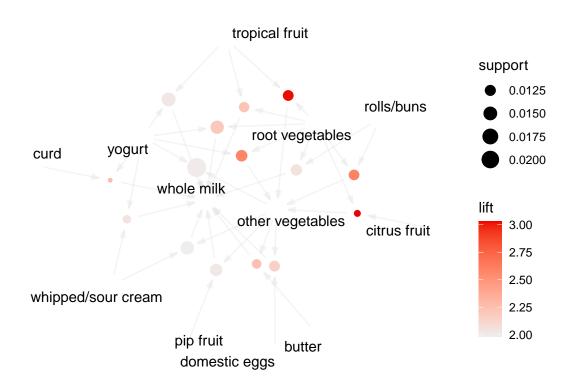
Plot Koordinat Selari

Parallel coordinates plot for 125 rules



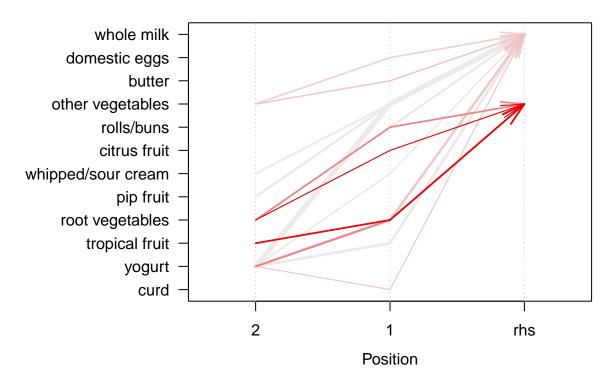
Jika bilangan aturan sekutuan yang diperolehi adalah terlalu banyak, perlu tinggikan nilai ambang ukuran untuk kekalkan aturan sekutuan yang lebih bermakna.

Support =
$$0.01$$
, Confidence = 0.5



plot(Aturan.S5, method='paracoord')

Parallel coordinates plot for 15 rules



Bagaimana untuk mendapatkan Aturan Sekutuan yang berkait dengan item tertentu?

Kes 1: Dapatkan aturan yang mempengaruhi Aturan Sekutuan yang berkai dengan item Y (RHS)

Contoh: Barangan apa yang akan dibeli terlebih dahulu sebelum pelanggan membeli item "other vegetables"

inspect(Aturan.S6)

```
##
        lhs
                                                   rhs
                                                                support
## [1]
       {curd, yogurt}
                                                => {whole milk} 0.01006609
## [2]
        {butter, other vegetables}
                                                => {whole milk} 0.01148958
## [3]
        {domestic eggs, other vegetables}
                                                => {whole milk} 0.01230300
## [4]
        {whipped/sour cream, yogurt}
                                                => {whole milk} 0.01087951
##
  [5]
        {other vegetables, whipped/sour cream} => {whole milk} 0.01464159
## [6]
        {other vegetables, pip fruit}
                                                => {whole milk} 0.01352313
## [7]
        {root vegetables, tropical fruit}
                                                => {whole milk} 0.01199797
        {tropical fruit, yogurt}
## [8]
                                                => {whole milk} 0.01514997
        {root vegetables, yogurt}
                                                => {whole milk} 0.01453991
## [10] {rolls/buns, root vegetables}
                                                => {whole milk} 0.01270971
## [11] {other vegetables, yogurt}
                                                => {whole milk} 0.02226741
        confidence coverage
##
                                       count
## [1] 0.5823529 0.01728521 2.279125 99
```

```
## [2]
     0.5736041 0.02003050 2.244885 113
  [3]
     ۲4٦
  [5]
     ##
  [6]
     0.5175097
              0.02613116 2.025351 133
##
  [7]
     0.5700483 0.02104728 2.230969 118
  [8]
     0.5173611
             0.02928317 2.024770 149
## [9]
     0.5629921
              0.02582613 2.203354 143
## [10] 0.5230126
              0.02430097 2.046888 125
## [11] 0.5128806 0.04341637 2.007235 219
```

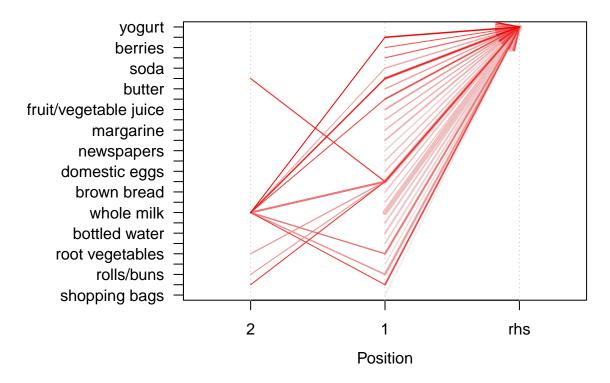
Contoh: Barangan apa yang akan dibeli terlebih dahulu sebelum pelanggan membeli item "yogurt"

inspect(Aturan.S7)

```
##
        lhs
                                                            support
                                                                       confidence
## [1]
        {}
                                                => {yogurt} 0.13950178 0.1395018
## [2]
        {berries}
                                                => {yogurt} 0.01057448 0.3180428
  [3]
        {cream cheese}
                                                => {yogurt} 0.01240468 0.3128205
## [4]
        {frozen vegetables}
                                                => {yogurt} 0.01240468 0.2579281
## [5]
        {beef}
                                                => {yogurt} 0.01169293 0.2228682
## [6]
        {curd}
                                                => {yogurt} 0.01728521 0.3244275
##
  [7]
        {napkins}
                                                => {yogurt} 0.01230300 0.2349515
  [8]
        {frankfurter}
                                                => {yogurt} 0.01118454 0.1896552
## [9]
        {brown bread}
                                                => {yogurt} 0.01453991 0.2241379
## [10] {margarine}
                                                => {yogurt} 0.01423488 0.2430556
## [11] {butter}
                                                => {yogurt} 0.01464159 0.2642202
                                                => {yogurt} 0.01535333 0.1923567
## [12] {newspapers}
## [13] {domestic eggs}
                                                => {yogurt} 0.01433655 0.2259615
## [14] {fruit/vegetable juice}
                                                => {yogurt} 0.01870869 0.2587904
## [15] {whipped/sour cream}
                                                => {yogurt} 0.02074225 0.2893617
## [16] {pip fruit}
                                                => {yogurt} 0.01799695 0.2379032
## [17] {pastry}
                                                => {yogurt} 0.01769192 0.1988571
## [18] {citrus fruit}
                                                => {yogurt} 0.02165735 0.2616708
## [19] {shopping bags}
                                                => {yogurt} 0.01525165 0.1547988
## [20] {sausage}
                                                => {yogurt} 0.01962379 0.2088745
## [21] {bottled water}
                                                => {yogurt} 0.02297916 0.2079117
                                                => {yogurt} 0.02928317 0.2790698
## [22] {tropical fruit}
## [23] {root vegetables}
                                                => {yogurt} 0.02582613 0.2369403
## [24] {soda}
                                                => {yogurt} 0.02735130 0.1568513
## [25] {rolls/buns}
                                                => {yogurt} 0.03436706 0.1868436
## [26] {other vegetables}
                                                => {yogurt} 0.04341637 0.2243826
## [27] {whole milk}
                                                => {yogurt} 0.05602440 0.2192598
## [28] {curd, whole milk}
                                                => {yogurt} 0.01006609 0.3852140
## [29] {other vegetables, whipped/sour cream} => {yogurt} 0.01016777 0.3521127
## [30] {whipped/sour cream, whole milk}
                                                => {yogurt} 0.01087951 0.3375394
## [31] {citrus fruit, whole milk}
                                                => {yogurt} 0.01026945 0.3366667
## [32] {other vegetables, tropical fruit}
                                                => {yogurt} 0.01230300 0.3427762
## [33] {tropical fruit, whole milk}
                                                => {yogurt} 0.01514997 0.3581731
## [34] {other vegetables, root vegetables}
                                                => {yogurt} 0.01291307 0.2725322
## [35] {root vegetables, whole milk}
                                                => {yogurt} 0.01453991 0.2972973
## [36] {soda, whole milk}
                                                => {yogurt} 0.01047280 0.2614213
## [37] {other vegetables, rolls/buns}
                                                => {yogurt} 0.01148958 0.2696897
```

```
## [38] {rolls/buns, whole milk}
                                              => {yogurt} 0.01555669 0.2746858
  [39] {other vegetables, whole milk}
                                              => {yogurt} 0.02226741 0.2975543
                  lift
##
        coverage
        1.00000000 1.000000 1372
## [1]
## [2]
       0.03324860 2.279848
## [3]
       0.03965430 2.242412
       0.04809354 1.848924
## [4]
## [5]
       0.05246568 1.597601
                             115
## [6]
       0.05327911 2.325615
                             170
## [7]
       0.05236401 1.684218
                             121
## [8]
       0.05897306 1.359518
## [9]
       0.06487036 1.606703
                             143
## [10] 0.05856634 1.742312
## [11] 0.05541434 1.894027
## [12] 0.07981698 1.378883
                             151
## [13] 0.06344687 1.619775
                             141
## [14] 0.07229283 1.855105
                             184
## [15] 0.07168277 2.074251
                             204
## [16] 0.07564820 1.705378
                             177
## [17] 0.08896797 1.425481
                             174
## [18] 0.08276563 1.875752
                             213
## [19] 0.09852567 1.109654
## [20] 0.09395018 1.497289
                             193
## [21] 0.11052364 1.490387
                             226
## [22] 0.10493137 2.000475
                             288
## [23] 0.10899847 1.698475
                             254
## [24] 0.17437722 1.124368
                             269
## [25] 0.18393493 1.339363
                             338
## [26] 0.19349263 1.608457
                             427
## [27] 0.25551601 1.571735
                             551
## [28] 0.02613116 2.761356
## [29] 0.02887646 2.524073
                             100
## [30] 0.03223183 2.419607
                             107
## [31] 0.03050330 2.413350
                             101
## [32] 0.03589222 2.457146
## [33] 0.04229792 2.567516
                             149
## [34] 0.04738180 1.953611
## [35] 0.04890696 2.131136
## [36] 0.04006101 1.873964
## [37] 0.04260295 1.933235
                             113
## [38] 0.05663447 1.969049
## [39] 0.07483477 2.132979
                             219
plot(Aturan.S7, method='paracoord',
control=list(reorder=T))
```

Parallel coordinates plot for 38 rules



Kes 2: dapatkan aturan bagi produk apa yang biasa dibeli selepas pembelian item X (LHS)

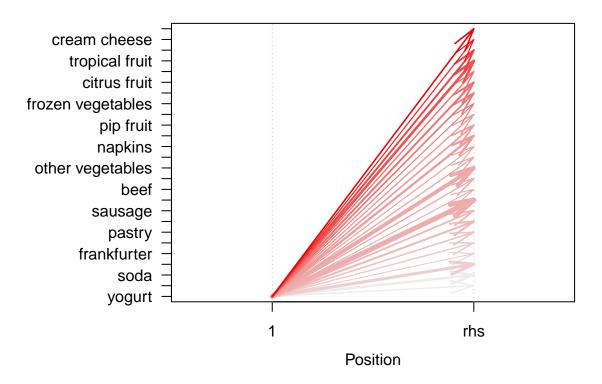
Barangan apa yang akan dibeli selepas membeli "yogurt".

inspect(Aturan.S8)

```
##
        lhs
                    rhs
                                             support
                                                         confidence coverage
## [1]
        {}
                 => {bottled beer}
                                             0.08052872 0.08052872 1.0000000
  [2]
                 => {pastry}
                                             0.08896797 0.08896797 1.0000000
        {}
                 => {citrus fruit}
   [3]
        {}
                                             0.08276563 0.08276563 1.0000000
##
                 => {shopping bags}
##
   [4]
        {}
                                             0.09852567 0.09852567 1.0000000
##
  [5]
        {}
                 => {sausage}
                                             0.09395018 0.09395018 1.0000000
##
  [6]
        {}
                 => {bottled water}
                                             0.11052364 0.11052364 1.0000000
                 => {tropical fruit}
  [7]
        {}
                                             0.10493137 0.10493137 1.0000000
##
                 => {root vegetables}
##
   [8]
        {}
                                             0.10899847 0.10899847 1.0000000
                 => {soda}
   [9]
        {}
                                             0.17437722 0.17437722 1.0000000
   [10] {}
                 => {rolls/buns}
                                             0.18393493 0.18393493 1.0000000
   [11]
       {}
                 => {other vegetables}
                                             0.19349263 0.19349263 1.0000000
                 => {whole milk}
                                             0.25551601 0.25551601 1.0000000
  [12]
       {}
  [13] {yogurt} => {cream cheese}
                                             0.01240468 0.08892128 0.1395018
  [14] {yogurt} => {frozen vegetables}
                                             0.01240468 0.08892128 0.1395018
  [15] {yogurt} => {beef}
                                             0.01169293 0.08381924 0.1395018
                                             0.01728521 0.12390671 0.1395018
  [16] {yogurt} => {curd}
  [17] {yogurt} => {napkins}
                                             0.01230300 0.08819242 0.1395018
  [18] {yogurt} => {frankfurter}
                                             0.01118454 0.08017493 0.1395018
```

```
## [19] {yogurt} => {brown bread}
                                        0.01453991 0.10422741 0.1395018
## [20] {yogurt} => {margarine}
                                       0.01423488 0.10204082 0.1395018
                                       0.01464159 0.10495627 0.1395018
## [21] {yogurt} => {butter}
## [22] {yogurt} => {newspapers}
                                       0.01535333 0.11005831 0.1395018
## [23] {yogurt} => {domestic eggs}
                                        0.01433655 0.10276968 0.1395018
## [24] {yogurt} => {fruit/vegetable juice} 0.01870869 0.13411079 0.1395018
## [25] {yogurt} => {whipped/sour cream} 0.02074225 0.14868805 0.1395018
## [26] {yogurt} => {pip fruit}
                                        0.01799695 0.12900875 0.1395018
## [27] {yogurt} => {pastry}
                                        0.01769192 0.12682216 0.1395018
## [28] {yogurt} => {citrus fruit}
                                        0.02165735 0.15524781 0.1395018
## [29] {yogurt} => {shopping bags}
                                        0.01525165 0.10932945 0.1395018
## [35] {yogurt} => {rolls/buns}
  [37] {yogurt} => {whole milk}
                                       0.05602440 0.40160350 0.1395018
##
       lift
                count
                792
## [1]
       1.000000
## [2]
       1.000000
                875
## [3]
       1.000000
                814
## [4]
       1.000000
                969
## [5]
                924
       1.000000
## [6]
       1.000000 1087
## [7]
       1.000000 1032
## [8]
       1.000000 1072
## [9]
       1.000000 1715
## [10] 1.000000 1809
## [11] 1.000000 1903
## [12] 1.000000 2513
## [13] 2.242412
                122
## [14] 1.848924
                122
## [15] 1.597601
                115
## [16] 2.325615
                170
## [17] 1.684218
                121
## [18] 1.359518
                110
## [19] 1.606703
                143
## [20] 1.742312
                140
## [21] 1.894027
## [22] 1.378883
                151
## [23] 1.619775
## [24] 1.855105
## [25] 2.074251
## [26] 1.705378
                177
## [27] 1.425481
                174
## [28] 1.875752
                213
## [29] 1.109654
                150
## [30] 1.497289
                193
## [31] 1.490387
                226
## [32] 2.000475
                288
## [33] 1.698475
                254
## [34] 1.124368
                269
```

Parallel coordinates plot for 25 rules



```
plot(Aturan.S8, method='graph')
```

