AssociationRuleMining.R

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```
#Installing the packages
#install.packages("Matrix")
#install.packages("arules")
#install.packages("qlcMatrix")
#install.packages("data.table")
#install.packages("qqplot2")
#install.packages("ggpubr")
#install.packages("gridExtra")
#install.packages("stringr")
#install.packages("RColorBrewer")
#set workspace to this folder
setwd("D:/Work/IJGIS/R-scripts")
#importing the packages
library(arules)
## Warning: package 'arules' was built under R version 3.5.3
## Loading required package: Matrix
## Warning: package 'Matrix' was built under R version 3.5.3
##
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
##
      abbreviate, write
library(qlcMatrix)
## Warning: package 'qlcMatrix' was built under R version 3.5.3
## Loading required package: slam
## Warning: package 'slam' was built under R version 3.5.3
```

```
## Loading required package: sparsesvd
## Warning: package 'sparsesvd' was built under R version 3.5.3
library(data.table)
## Warning: package 'data.table' was built under R version 3.5.3
## Attaching package: 'data.table'
## The following object is masked from 'package:slam':
##
     rollup
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 3.5.3
library(ggpubr)
## Warning: package 'ggpubr' was built under R version 3.5.3
## Loading required package: magrittr
## Warning: package 'magrittr' was built under R version 3.5.3
library(gridExtra)
## Warning: package 'gridExtra' was built under R version 3.5.3
library(stringr)
## Warning: package 'stringr' was built under R version 3.5.3
library(RColorBrewer)
type_raw <- read.table(file = "../sequences/type-nf-all.txt", sep = ",")</pre>
transpose_type_raw <- t(type_raw)[1, ]</pre>
pw <- pwMatrix(transpose_type_raw, sep = " ")</pre>
tt <- ttMatrix(pw$rownames)</pre>
```

```
distr <- (tt$M*1) %*% (pw$M*1)</pre>
distr_ngCMat = as (distr, "ngCMatrix")
ttRows <- tt$rownames
td <- as.data.frame(ttRows)
setnames(td, "ttRows", "labels")
trans1 <- new("transactions", data = distr ngCMat, itemInfo = td)
type_rules <- apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2],
                                               confidence = 0.5, maxlen = 3, maxtime = 15))
## Apriori
##
## Parameter specification:
   confidence minval smax arem aval originalSupport maxtime
                                                                 support minlen
##
          0.5
                 0.1
                        1 none FALSE
                                                TRUE
                                                           15 0.01638002
  maxlen target ext
##
##
         3 rules FALSE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
                                         TRUE
##
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[6484 item(s), 6105 transaction(s)] done [0.03s].
## sorting and recoding items ... [28 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
## done [0.00s].
## writing ... [40 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
type_rules_d <- inspect(head(sort(type_rules, by = "lift"), 100))
##
        lhs
                            rhs
                                     support
                                                confidence lift
                                                                    count
## [1]
       {ADM2,Q-PPLA2}
                         => {Q-ADM1} 0.01785422 0.6942675 1.796737
                                                                    109
## [2]
       {Q-ADM1,Q-PPL}
                         => {ADM2}
                                   0.08468468 0.8503289 1.681107
                                                                    517
## [3]
       {Q-,Q-ADM1}
                         => {ADM2}
                                    0.03652744 0.8446970 1.669972
                                                                     223
## [4]
       {PCLI,Q-}
                        => {ADM2}
                                    0.03439803 0.8235294 1.628124 210
## [5]
       {Q-ADM1,Q-PPLA2} \Rightarrow {ADM2}
                                    0.01785422 0.8195489 1.620254 109
                                    0.07567568 0.8105263 1.602417 462
## [6]
                        => {ADM2}
       {PCLI,Q-PPL}
## [7]
       {Q-PPLA2}
                        => {Q-ADM1} 0.02178542 0.6186047 1.600925 133
                                    0.01670762 0.8095238 1.600435 102
## [8]
       {PCLI,Q-PPLA2} => {ADM2}
## [9] {ADM2,Q-PPL}
                     => {Q-ADM1} 0.08468468 0.6103896 1.579665 517
## [10] {ADM2,PCLI}
                       => {Q-ADM1} 0.15298935 0.5979513 1.547475 934
```

```
## [11] {PCLI,Q-ADM1}
                      => {ADM2}
                                  0.15298935 0.7796327 1.541340 934
## [12] {ADM2,Q-PPLA2}
                     => {PCLI}
                                  0.01670762 0.6496815 1.520240 102
## [13] {ADM2,Q-}
                      => {Q-ADM1} 0.03652744 0.5807292 1.502904 223
## [14] {Q-ADM1}
                      => {ADM2}
                                  0.28992629 0.7503179 1.483384 1770
## [15] {ADM2}
                      => {Q-ADM1} 0.28992629 0.5731865 1.483384 1770
                     => {Q-ADM1} 0.05339885 0.5719298 1.480132 326
## [16] {PCLI,Q-PPL}
## [17] {Q-PPLA2}
                     => {ADM2}
                                  0.02571663 0.7302326 1.443675 157
## [18] {Q-}
                      => {ADM2}
                                  0.06289926 0.7286528 1.440552
## [19] {PCLI,Q-}
                      => {Q-ADM1} 0.02260442 0.5411765 1.400544
                                                               138
## [20] {Q-PPLA2}
                      => {PCLI} 0.02063882 0.5860465 1.371335 126
## [21] {Q-ADM1,Q-ADM2} => {ADM2}
                                 0.03783784 0.6834320 1.351150
## [22] {Q-PPL}
                      => {ADM2}
                                 0.13873874 0.6653574 1.315417
                                                               847
## [23] {Q-AREA}
                      => {ADM2}
                                 0.02538903 0.6595745 1.303984 155
## [24] {Q-}
                     => {Q-ADM1} 0.04324324 0.5009488 1.296436 264
## [25] {ADM2,Q-}
                     => {PCLI}
                                0.03439803 0.5468750 1.279675 210
## [26] {ADM2,Q-PPL}
                      => {PCLI}
                                  0.07567568 0.5454545 1.276351
                                                               462
                      => {PCLI}
                                                               324
## [27] {ADM2,Q-ADM2}
                                 0.05307125 0.5391015 1.261485
## [28] {Q-ADM1,Q-PPL}
                      => {PCLI} 0.05339885 0.5361842 1.254659
                                                               326
## [29] {Q-ADM1,Q-ADM2} => {PCLI} 0.02964783 0.5355030 1.253065 181
## [30] {ADM2,Q-ADM1}
                      => {PCLI}
                                 0.15298935 0.5276836 1.234768 934
## [31] {Q-,Q-ADM1}
                      => {PCLI}
                                 0.02260442 0.5227273 1.223170 138
## [32] {Q-ADM1}
                      => {PCLI} 0.19623260 0.5078423 1.188339 1198
## [33] {PCLI,Q-ADM2}
                      => {ADM2}
                                 0.05307125 0.6000000 1.186205 324
## [34] {ADM1,ADM2}
                      => {PCLI}
                                0.04029484 0.5061728 1.184433 246
## [35] {ADM2}
                      => {PCLI} 0.25585586 0.5058290 1.183628 1562
                      => {ADM2} 0.25585586 0.5986968 1.183628 1562
## [36] {PCLI}
## [37] {Q-ADM2}
                      => {PCLI}
                                0.08845209 0.5037313 1.178720 540
## [38] {Q-ADM2}
                      => {ADM2}
                                 0.09844390 0.5606343 1.108378
## [39] {ADM1,PCLI}
                      => {ADM2}
                                 0.04029484 0.5061728 1.000708 246
                      => {ADM2}
## [40] {}
                                 0.50581491 0.5058149 1.000000 3088
#plot(type_rules, jitter = 0)
write.csv(x = type_rules_d, file = "result/type_rules_qa.csv")
scale_raw <- read.table("../sequences/scale-nf-all.txt", sep = ",")</pre>
transpose_scale_raw <- t(scale_raw)[1, ]</pre>
pw_scale <- pwMatrix(transpose_scale_raw, sep = " ")</pre>
tt_scale <- ttMatrix(pw_scale$rownames)</pre>
distr_scale <- (tt_scale$M*1) %*% (pw_scale$M*1)</pre>
distr_ngCMat_scale = as (distr_scale, "ngCMatrix")
ttRows_scale <- tt_scale$rownames
td_scale <- as.data.frame(ttRows_scale)</pre>
setnames(td_scale, "ttRows_scale", "labels")
trans_scale <- new("transactions", data = distr_ngCMat_scale, itemInfo = td_scale)</pre>
scale_rules <- apriori(trans_scale, parameter = list(support = 100/trans_scale@data@Dim[2],</pre>
```

```
## Apriori
## Parameter specification:
   confidence minval smax arem aval originalSupport maxtime
                                                                  support minlen
                         1 none FALSE
##
                  0.1
                                                 TRUE
                                                           15 0.02654632
##
   maxlen target
                    ext
##
         3 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                         TRUE
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[3783 item(s), 3767 transaction(s)] done [0.01s].
## sorting and recoding items ... [13 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans_scale, parameter = list(support = 100/
## trans_scale@data@Dim[2], : Mining stopped (maxlen reached). Only patterns up to
## a length of 3 returned!
## done [0.00s].
## writing ... [43 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
inspect(head(sort(scale_rules, by = "support"), 100))
##
        lhs
                     rhs
                           support
                                      confidence lift
                                                            count
## [1]
       {}
                  => {A-7} 0.56225113 0.5622511 1.0000000 2118
## [2]
       {}
                  => {A-9} 0.52428989 0.5242899
                                                1.0000000 1975
```

```
## [3]
                  => {Q-6} 0.51499867 0.5149987
        {}
                                                   1.0000000 1940
## [4]
                  => {A-7} 0.38173613 0.7768774
        \{Q-8\}
                                                  1.3817266 1438
## [5]
        \{A-7\}
                  => {Q-8} 0.38173613 0.6789424
                                                  1.3817266 1438
## [6]
        {Q-6}
                  => {A-7} 0.33315636 0.6469072
                                                  1.1505663 1255
## [7]
        \{A-7\}
                  => {Q-6} 0.33315636 0.5925401
                                                  1.1505663 1255
                  => {A-7} 0.31510486 0.6010127
## [8]
        \{A-9\}
                                                   1.0689399 1187
## [9]
       \{A-7\}
                  => {A-9} 0.31510486 0.5604344
                                                  1.0689399 1187
## [10] {Q-6}
                  => {A-9} 0.27847093 0.5407216
                                                   1.0313410 1049
                  => {Q-6} 0.27847093 0.5311392
## [11] {A-9}
                                                   1.0313410 1049
## [12] {Q-8}
                  => {A-9} 0.27581630 0.5613182
                                                   1.0706257 1039
## [13] {A-9}
                  => {Q-8} 0.27581630 0.5260759
                                                   1.0706257 1039
## [14] {Q-8}
                  => {Q-6} 0.25457924 0.5180983
                                                   1.0060188
## [15] {Q-6,Q-8} => {A-7} 0.21953809 0.8623566
                                                   1.5337570 827
## [16] \{A-7,Q-8\} \Rightarrow \{Q-6\} \ 0.21953809 \ 0.5751043
                                                   1.1167103 827
## [17] {A-7,Q-6} => {Q-8} 0.21953809 0.6589641
                                                  1.3410686 827
## [18] \{A-9,Q-8\} \Rightarrow \{A-7\} \ 0.21343244 \ 0.7738210
                                                  1.3762907
## [19] {A-7,Q-8} => {A-9} 0.21343244 0.5591099 1.0664136 804
```

```
## [20] \{A-7, A-9\} \Rightarrow \{Q-8\} \ 0.21343244 \ 0.6773378
                                                          1.3784612
   [21] {A-9,Q-6} => {A-7} 0.19617733 0.7044805
                                                                       739
                                                          1.2529641
   [22] \{A-7,Q-6\} \Rightarrow \{A-9\} \ 0.19617733 \ 0.5888446
                                                          1.1231279
                                                                       739
   [23] \{A-7, A-9\} \Rightarrow \{Q-6\} \ 0.19617733 \ 0.6225779
                                                                       739
                                                          1.2088923
## [24] {Q-6,Q-8} => {A-9} 0.14600478 0.5735141
                                                          1.0938874
                                                                       550
## [25] \{A-9,Q-8\} \Rightarrow \{Q-6\} \ 0.14600478 \ 0.5293551
                                                          1.0278767
                                                                       550
## [26] \{A-9,Q-6\} \Rightarrow \{Q-8\} \ 0.14600478 \ 0.5243089
                                                          1.0670294
                                                                       550
## [27] {A-8}
                     => {Q-6} 0.12768782 0.5268346
                                                          1.0229825
                                                                       481
## [28] {Q-7}
                     => {A-9} 0.11043271 0.5745856
                                                          1.0959312
                                                                       416
##
   [29] {Q-7}
                     => {A-7} 0.10618529 0.5524862
                                                          0.9826324
                                                                       400
   [30] \{A-6\}
                     => {Q-6} 0.09822140 0.5117566
                                                          0.9937046
                                                                       370
   [31] \{A-9,Q-7\} \Rightarrow \{A-7\} \ 0.06264932 \ 0.5673077
                                                          1.0089934
                                                                       236
                                                                       236
   [32] \{A-7,Q-7\} \Rightarrow \{A-9\} \ 0.06264932 \ 0.5900000
                                                          1.1253316
   [33] \{A-8,A-9\} \Rightarrow \{Q-6\} \ 0.05972923 \ 0.5984043
                                                          1.1619530
                                                                       225
## [34] {Q-7,Q-8} \Rightarrow {A-7} 0.05680913 0.6666667
                                                          1.1857098
                                                                       214
   [35] {A-7,Q-7} => {Q-8} 0.05680913 0.5350000
                                                          1.0887871
                                                                       214
   [36] \{A-7,A-8\} \Rightarrow \{Q-6\} 0.05123440 0.6126984
                                                          1.1897087
                                                                       193
   [37] {A-7,A-8} => {A-9} 0.04884523 0.5841270
                                                          1.1141298
   [38] \{Q-7,Q-8\} \Rightarrow \{A-9\} \ 0.04698699 \ 0.5514019
                                                          1.0517118
                                                                       177
## [39] \{A-6,A-7\} \Rightarrow \{Q-8\} \ 0.03424476 \ 0.5633188
                                                          1.1464191
## [40] {Q-5,Q-8} \Rightarrow {A-7} 0.03371383 0.7937500
                                                          1.4117357
                                                                       127
## [41] \{A-7,Q-5\} \Rightarrow \{Q-8\} \ 0.03371383 \ 0.5746606
                                                          1.1695011
## [42] \{A-6,A-7\} \Rightarrow \{Q-6\} \ 0.03371383 \ 0.5545852
                                                          1.0768671
                                                                       127
## [43] \{A-6,A-9\} \Rightarrow \{Q-6\} 0.03026281 0.5700000
                                                          1.1067990
                                                                       114
scale_rules_d <- inspect(head(sort(scale_rules, by = "support"), 100))</pre>
##
                                             confidence lift
         lhs
                         rhs
                                support
## [1]
         {}
                     => {A-7} 0.56225113 0.5622511
                                                          1.0000000 2118
```

```
##
   [2]
         {}
                     => {A-9} 0.52428989 0.5242899
                                                         1.0000000 1975
   [3]
##
         {}
                    => {Q-6} 0.51499867 0.5149987
                                                         1.0000000 1940
   [4]
                    => {A-7} 0.38173613 0.7768774
##
         \{Q-8\}
                                                         1.3817266 1438
##
   [5]
         \{A-7\}
                    => {Q-8} 0.38173613 0.6789424
                                                         1.3817266 1438
   [6]
                    => {A-7} 0.33315636 0.6469072
##
         \{Q-6\}
                                                         1.1505663 1255
## [7]
         \{A-7\}
                    => {Q-6} 0.33315636 0.5925401
                                                         1.1505663 1255
## [8]
         \{A-9\}
                    => {A-7} 0.31510486 0.6010127
                                                         1.0689399 1187
##
   [9]
         \{A-7\}
                    => {A-9} 0.31510486 0.5604344
                                                         1.0689399 1187
## [10] {Q-6}
                    => {A-9} 0.27847093 0.5407216
                                                         1.0313410 1049
   [11] \{A-9\}
                    => {Q-6} 0.27847093 0.5311392
                                                         1.0313410 1049
## [12] {Q-8}
                    => {A-9} 0.27581630 0.5613182
                                                         1.0706257 1039
## [13] {A-9}
                    => {Q-8} 0.27581630 0.5260759
                                                         1.0706257 1039
## [14] {Q-8}
                    => {Q-6} 0.25457924 0.5180983
                                                         1.0060188
## [15] \{Q-6,Q-8\} \Rightarrow \{A-7\} \ 0.21953809 \ 0.8623566
                                                         1.5337570
                                                                     827
   [16] \{A-7,Q-8\} \Rightarrow \{Q-6\} \ 0.21953809 \ 0.5751043
                                                                     827
                                                         1.1167103
   [17] \{A-7,Q-6\} \Rightarrow \{Q-8\} \ 0.21953809 \ 0.6589641
                                                         1.3410686
                                                                     827
   [18] \{A-9,Q-8\} \Rightarrow \{A-7\} \ 0.21343244 \ 0.7738210
                                                         1.3762907
                                                                      804
   [19] \{A-7,Q-8\} \Rightarrow \{A-9\} \ 0.21343244 \ 0.5591099
                                                                     804
                                                         1.0664136
## [20] \{A-7, A-9\} \Rightarrow \{Q-8\} \ 0.21343244 \ 0.6773378
                                                         1.3784612
                                                                     804
## [21] \{A-9,Q-6\} \Rightarrow \{A-7\} \ 0.19617733 \ 0.7044805
                                                         1.2529641
                                                                     739
## [22] {A-7,Q-6} => {A-9} 0.19617733 0.5888446
                                                         1.1231279
                                                                     739
## [23] \{A-7, A-9\} \Rightarrow \{Q-6\} \ 0.19617733 \ 0.6225779
                                                                     739
                                                         1.2088923
## [24] {Q-6,Q-8} => {A-9} 0.14600478 0.5735141
                                                         1.0938874
                                                                     550
## [25] \{A-9,Q-8\} \Rightarrow \{Q-6\} \ 0.14600478 \ 0.5293551
                                                        1.0278767
                                                                      550
## [26] \{A-9,Q-6\} \Rightarrow \{Q-8\} \ 0.14600478 \ 0.5243089
                                                        1.0670294
                                                                     550
```

```
## [27] {A-8}
                => {Q-6} 0.12768782 0.5268346 1.0229825 481
## [28] {Q-7}
                => {A-9} 0.11043271 0.5745856 1.0959312 416
                => {A-7} 0.10618529 0.5524862 0.9826324 400
## [29] {Q-7}
## [30] {A-6}
                => {Q-6} 0.09822140 0.5117566 0.9937046 370
## [31] \{A-9,Q-7\} \Rightarrow \{A-7\} \ 0.06264932 \ 0.5673077 \ 1.0089934 \ 236
## [32] {A-7,Q-7} => {A-9} 0.06264932 0.5900000 1.1253316 236
## [33] {A-8,A-9} => {Q-6} 0.05972923 0.5984043 1.1619530 225
## [34] {Q-7,Q-8} => {A-7} 0.05680913 0.6666667 1.1857098 214
## [35] {A-7,Q-7} => {Q-8} 0.05680913 0.5350000 1.0887871 214
## [36] {A-7,A-8} => {Q-6} 0.05123440 0.6126984 1.1897087 193
## [37] {A-7,A-8} => {A-9} 0.04884523 0.5841270 1.1141298 184
## [38] {Q-7,Q-8} => {A-9} 0.04698699 0.5514019 1.0517118 177
## [39] {A-6,A-7} => {Q-8} 0.03424476 0.5633188 1.1464191 129
## [40] {Q-5,Q-8} => {A-7} 0.03371383 0.7937500 1.4117357 127
## [41] {A-7,Q-5} => {Q-8} 0.03371383 0.5746606 1.1695011 127
## [42] {A-6,A-7} => {Q-6} 0.03371383 0.5545852 1.0768671 127
## [43] {A-6,A-9} => {Q-6} 0.03026281 0.5700000 1.1067990 114
#plot(scale rules, jitter = 0)
write.csv(x = scale_rules_d, file = "result/scale_rules_qa.csv")
#############PROMINENCE##############
imp_raw <- read.table("../sequences/prominence-nf-all.txt", sep = ",")</pre>
transpose_imp_raw <- t(imp_raw)[1, ]</pre>
pw_imp <- pwMatrix(transpose_imp_raw, sep = " ")</pre>
tt_imp <- ttMatrix(pw_imp$rownames)</pre>
distr_imp <- (tt_imp$M*1) %*% (pw_imp$M*1)
distr_ngCMat_imp = as (distr_imp, "ngCMatrix")
ttRows_imp <- tt_imp$rownames
td_imp <- as.data.frame(ttRows_imp)</pre>
setnames(td imp, "ttRows imp", "labels")
trans imp <- new("transactions", data = distr ngCMat imp, itemInfo = td imp)
imp_rules <- apriori(trans_imp, parameter = list(support = 100/trans_imp@data@Dim[2],</pre>
                                              confidence = 0.5, maxlen = 3, maxtime = 15))
## Apriori
##
## Parameter specification:
  confidence minval smax arem aval originalSupport maxtime
                                                             support minlen
##
          0.5
                0.1
                       1 none FALSE
                                              TRUE
                                                       15 0.01696065
##
   maxlen target
                  ext
##
        3 rules FALSE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
##
      0.1 TRUE TRUE FALSE TRUE
##
```

```
## Absolute minimum support count: 100
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[5910 item(s), 5896 transaction(s)] done [0.02s].
## sorting and recoding items ... [14 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans_imp, parameter = list(support = 100/
## trans_imp@data@Dim[2], : Mining stopped (maxlen reached). Only patterns up to a
## length of 3 returned!
## done [0.00s].
## writing ... [21 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
inspect(head(sort(imp_rules, by = "support"), 100))
##
         lhs
                                           confidence lift
                       rhs
                              support
                                                                 count
## [1]
        \{A-4\}
                    => {A-7} 0.19063772 0.5316935
                                                       1.107335 1124
## [2]
        \{Q-6\}
                    => {A-4} 0.17944369 0.5163494
                                                       1.440112 1058
## [3]
         \{A-4\}
                    => {Q-6} 0.17944369 0.5004730
                                                       1.440112 1058
## [4]
        \{Q-6\}
                    => {A-7} 0.17808684 0.5124451
                                                       1.067247 1050
## [5]
        \{Q-3\}
                    => {A-7} 0.16570556 0.5005123
                                                       1.042395
         \{A-4,Q-6\} \Rightarrow \{A-7\} \ 0.09616689 \ 0.5359168
## [6]
                                                       1.116131
                                                                  567
## [7]
         \{A-7,Q-6\} => \{A-4\} 0.09616689 0.5400000
                                                       1.506074
                                                                  567
## [8]
         {A-4,A-7} \Rightarrow {Q-6} 0.09616689 0.5044484
                                                       1.451551
                                                                  567
## [9]
        \{Q-4\}
                    => {A-7} 0.08344640 0.5162644
                                                       1.075201
## [10] \{A-4,Q-3\} => \{A-7\} 0.07547490 0.5380895
                                                       1.120655
                                                                  445
## [11] \{Q-3,Q-6\} \Rightarrow \{A-4\} \ 0.06580733 \ 0.5914634
                                                       1.649607
## [12] \{A-4,Q-2\} \Rightarrow \{A-7\} \ 0.06512890 \ 0.5638767
                                                       1.174361
                                                                  384
## [13] \{Q-2,Q-6\} \Rightarrow \{A-4\} \ 0.05885346 \ 0.6087719
                                                       1.697880
## [14] {A-4,Q-2} => {Q-6} 0.05885346 0.5095448
                                                       1.466216
                                                                  347
## [15] \{Q-2,Q-6\} \Rightarrow \{A-7\} \ 0.05088195 \ 0.5263158
                                                       1.096135
                                                                  300
## [16] \{A-4,A-6\} \Rightarrow \{A-7\} \ 0.03476934 \ 0.5099502
                                                                  205
                                                       1.062051
## [17] \{A-3,Q-6\} \Rightarrow \{Q-3\} \ 0.03171642 \ 0.5040431
                                                       1.522458
## [18] \{A-4,Q-4\} \Rightarrow \{A-7\} \ 0.02917232 \ 0.5530547
                                                       1.151823
                                                                  172
## [19] \{A-3,A-4\} \Rightarrow \{Q-3\} \ 0.02662822 \ 0.5508772
                                                       1.663920
                                                                  157
## [20] \{Q-4,Q-6\} \Rightarrow \{A-7\} \ 0.02306649 \ 0.5714286
                                                       1.190089
## [21] \{Q-4,Q-6\} \Rightarrow \{A-4\} \ 0.02069199 \ 0.5126050
                                                      1.429669
imp_rules_d <- inspect(head(sort(imp_rules, by = "support"), 100))</pre>
##
         lhs
                       rhs
                              support
                                           confidence lift
                                                                 count
## [1]
        \{A-4\}
                    => {A-7} 0.19063772 0.5316935
                                                       1.107335 1124
## [2]
        \{Q-6\}
                    => {A-4} 0.17944369 0.5163494
                                                       1.440112 1058
## [3]
                    => {Q-6} 0.17944369 0.5004730
         \{A-4\}
                                                       1.440112 1058
## [4]
         \{Q-6\}
                    => {A-7} 0.17808684 0.5124451
                                                       1.067247 1050
## [5]
        {Q-3}
                    => {A-7} 0.16570556 0.5005123
                                                       1.042395
## [6]
        \{A-4,Q-6\} \Rightarrow \{A-7\} \ 0.09616689 \ 0.5359168
                                                       1.116131
                                                                  567
        \{A-7,Q-6\} \Rightarrow \{A-4\} \ 0.09616689 \ 0.5400000
## [7]
                                                       1.506074
        \{A-4,A-7\} => \{Q-6\} 0.09616689 0.5044484
## [8]
                                                      1.451551
```

```
## [9] {Q-4}
             => {A-7} 0.08344640 0.5162644 1.075201 492
## [10] \{A-4,Q-3\} \Rightarrow \{A-7\} \ 0.07547490 \ 0.5380895 \ 1.120655 \ 445
## [11] {Q-3,Q-6} => {A-4} 0.06580733 0.5914634 1.649607 388
## [12] {A-4,Q-2} => {A-7} 0.06512890 0.5638767 1.174361 384
## [13] {Q-2,Q-6} \Rightarrow {A-4} 0.05885346 0.6087719 1.697880 347
## [14] {A-4,Q-2} => {Q-6} 0.05885346 0.5095448 1.466216 347
## [15] {Q-2,Q-6} => {A-7} 0.05088195 0.5263158 1.096135 300
## [16] \{A-4,A-6\} => \{A-7\} 0.03476934 0.5099502 1.062051 205
## [17] {A-3,Q-6} => {Q-3} 0.03171642 0.5040431 1.522458 187
## [18] \{A-4,Q-4\} \Rightarrow \{A-7\} \ 0.02917232 \ 0.5530547 \ 1.151823 \ 172
## [19] {A-3,A-4} => {Q-3} 0.02662822 0.5508772 1.663920 157
## [20] {Q-4,Q-6} => {A-7} 0.02306649 0.5714286 1.190089 136
## [21] {Q-4,Q-6} => {A-4} 0.02069199 0.5126050 1.429669 122
write.csv(x = imp_rules_d, file = "result/prominence_rules_qa.csv")
fun.extract.ncomplex.ids = function(questions, n) {
 validIds = c()
 counter = 0
 for (i in 1:length(questions[,1])) {
   qVals = questions[i, 2:length(questions)]
   if (length(qVals[qVals!=""]) == n) {
     counter= counter + 1
     validIds[counter] = questions[i, 1]
 }
 return (validIds)
fun.write.simple.complex = function(all, questions, fileAddressSWQ, fileAddressDWQ) {
 swq_ids <- fun.extract.ncomplex.ids(questions, 1)</pre>
 swq <- all[all$V1 %in% swq_ids, 2:length(all)]</pre>
 dwq <- all[!all$V1 %in% swq_ids, 2:length(all)]</pre>
 write.table(row.names = FALSE, file = fileAddressSWQ, x = swq, col.names = FALSE)
 write.table(row.names = FALSE, file = fileAddressDWQ, x = dwq, col.names = FALSE)
 return (TRUE)
fun.extract.rules = function(inputAddress, outputAddress, minconf, minsup, window) {
 raw <- read.table(inputAddress, sep = ",")</pre>
 transpose_raw <- t(raw)[1, ]</pre>
 pw <- pwMatrix(transpose_raw, sep = " ")</pre>
 tt <- ttMatrix(pw$rownames)</pre>
 distr <- (tt$M*1) %*% (pw$M*1)</pre>
 distr ngCMat = as (distr, "ngCMatrix")
 ttRows <- tt$rownames
 td <- as.data.frame(ttRows)
```

```
setnames(td, "ttRows", "labels")
 trans1 <- new("transactions", data = distr_ngCMat, itemInfo = td)</pre>
 rules <- apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2],
                                          confidence = 0.5, maxlen = window, maxtime = 15))
 rules_d <- inspect(head(sort(rules, by = "support"), 100))</pre>
 write.csv(x = rules d, file = outputAddress)
 return (rules)
prominence_questions <- read.table("../sequences/prominence-nf-Q.txt",</pre>
                                 header = FALSE, sep = " ", col.names = paste0("V", seq_len(5)),
                                 fill = TRUE)
prominence_all <- read.table("../sequences/prominence-nf-all.txt",</pre>
                           header = FALSE, sep = " ", col.names = paste0("V",seq_len(20)),
                           fill = TRUE)
prominence_answers <- read.table("../sequences/prominence-nf-A.txt",
                               header = FALSE, sep = " ", col.names = paste0("V", seq_len(15)),
                               fill = TRUE)
scale_questions <- read.table("../sequences/scale-nf-Q.txt",</pre>
                            header = FALSE, sep = " ", col.names = paste0("V", seq_len(4)),
                            fill = TRUE)
scale all <- read.table("../sequences/scale-nf-all.txt",</pre>
                      header = FALSE, sep = " ", col.names = paste0("V", seq len(20)),
                       fill = TRUE)
scale_answers <- read.table("../sequences/scale-nf-A.txt",</pre>
                          header = FALSE, sep = " ", col.names = paste0("V", seq_len(15)),
                          fill = TRUE)
type_questions <- read.table("../sequences/type-nf-Q.txt",</pre>
                           header = FALSE, sep = " ", col.names = paste0("V", seq_len(5)),
                           fill = TRUE)
type_all <- read.table("../sequences/type-nf-all.txt",</pre>
                      header = FALSE, sep = " ", col.names = paste0("V", seq_len(20)),
                      fill = TRUE)
type_answers <- read.table("../sequences/type-nf-A.txt",</pre>
                         header = FALSE, sep = " ", col.names = paste0("V", seq_len(15)),
                         fill = TRUE)
fun.write.simple.complex(all= prominence_all, questions = prominence_questions,
                        fileAddressSWQ = "../sequences/prominence-nf-all-SWQ.txt",
                        fileAddressDWQ = "../sequences/prominence-nf-all-DWQ.txt")
## [1] TRUE
fun.write.simple.complex(all= scale_all, questions = scale_questions,
                        fileAddressSWQ = "../sequences/scale-nf-all-SWQ.txt",
                        fileAddressDWQ = "../sequences/scale-nf-all-DWQ.txt")
```

```
## [1] TRUE
```

```
fun.write.simple.complex(all= type_all, questions = type_questions,
                       fileAddressSWQ = "../sequences/type-nf-all-SWQ.txt",
                       fileAddressDWQ = "../sequences/type-nf-all-DWQ.txt")
## [1] TRUE
fun.write.simple.complex(all= type_questions, questions = type_questions,
                       fileAddressSWQ = "../sequences/type-nf-Q-SWQ.txt",
                       fileAddressDWQ = "../sequences/type-nf-Q-DWQ.txt")
## [1] TRUE
fun.write.simple.complex(all= type_answers, questions = type_questions,
                       fileAddressSWQ = "../sequences/type-nf-A-SWQ.txt",
                       fileAddressDWQ = "../sequences/type-nf-A-DWQ.txt")
## [1] TRUE
scale_rules_swq = fun.extract.rules (inputAddress = "../sequences/scale-nf-all-SWQ.txt",
                                   outputAddress = "result/scale_swq_rules_qa.csv",
                                   minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval originalSupport maxtime
                                                              support minlen
                       1 none FALSE
##
          0.5
                 0.1
                                              TRUE
                                                        15 0.05263158
##
  maxlen target
##
        3 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
      0.1 TRUE TRUE FALSE TRUE
##
                                       TRUE.
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[18 item(s), 1900 transaction(s)] done [0.00s].
## sorting and recoding items ... [15 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
```

```
done [0.00s].
   writing ... [125 rule(s)] done [0.00s].
                         ... done [0.00s].
   creating S4 object
##
          lhs
                        rhs
                               support
                                            confidence lift
                                                                  count
##
   [1]
          {}
                     =>
                        {}
                               1.00000000 1.0000000
                                                        1.000000 1900
   [2]
##
          {}
                        {NA}
                               1.00000000 1.0000000
                                                        1.000000 1900
                     =>
   [3]
##
          {}
                     =>
                        {NA}
                               1.00000000 1.0000000
                                                        1.000000 1900
##
   [4]
          {NA}
                     =>
                        {}
                               1.00000000 1.0000000
                                                        1.000000 1900
##
   [5]
          {}
                        {A-9} 0.53315789 0.5331579
                                                        1.000000 1013
                     =>
   [6]
##
          \{A-9\}
                     =>
                        {}
                               0.53315789 1.0000000
                                                        1.000000 1013
##
   [7]
          {}
                        {A-9} 0.53315789 0.5331579
                                                        1.000000 1013
   [8]
##
          \{A-9\}
                        {NA}
                               0.53315789 1.0000000
                                                        1.000000 1013
##
   [9]
          {NA}
                        {A-9} 0.53315789 0.5331579
                                                        1.000000 1013
                     =>
          \{,A-9\}
##
   [10]
                     =>
                        {NA}
                               0.53315789 1.0000000
                                                        1.000000 1013
   [11]
          \{A-9,NA\}
##
                     =>
                        {}
                               0.53315789 1.0000000
                                                        1.000000 1013
##
   [12]
          {,NA}
                     =>
                        {A-9} 0.53315789 0.5331579
                                                        1.000000 1013
##
   [13]
          \{A-8\}
                        {}
                               0.40052632 1.0000000
                                                        1.000000
                                                                   761
                     =>
   [14]
          \{A-8\}
                               0.40052632 1.0000000
                                                        1.000000
                                                                   761
                        {NA}
##
   [15]
          \{,A-8\}
                        {NA}
                               0.40052632 1.0000000
                                                        1.000000
                                                                   761
                     =>
##
   [16]
          \{A-8,NA\}
                     =>
                        {}
                               0.40052632 1.0000000
                                                        1.000000
                                                                   761
##
   [17]
          \{A-7\}
                     =>
                        {}
                               0.38894737 1.0000000
                                                        1.000000
                                                                   739
   [18]
          \{A-7\}
                                                        1.000000
##
                        {NA}
                               0.38894737 1.0000000
                                                                   739
          \{,A-7\}
##
   [19]
                        {NA}
                               0.38894737 1.0000000
                                                        1.000000
                                                                   739
                     =>
          \{A-7,NA\}
##
   [20]
                     =>
                        {}
                               0.38894737 1.0000000
                                                        1.000000
                                                                   739
##
   [21]
          \{Q-6\}
                     => {}
                               0.38684211 1.0000000
                                                        1.000000
                                                                   735
   [22]
          {Q-6}
                     =>
                        {NA}
                               0.38684211 1.0000000
                                                        1.000000
                                                                   735
   [23]
          \{,Q-6\}
                                                                   735
##
                     =>
                        {NA}
                               0.38684211 1.0000000
                                                        1.000000
   [24]
##
          \{NA,Q-6\}
                     =>
                        {}
                               0.38684211 1.0000000
                                                        1.000000
                                                                   735
##
   [25]
          \{A-7\}
                        {A-9} 0.22210526 0.5710419
                     =>
                                                        1.071056
                                                                   422
##
   [26]
          \{A-7, A-9\} =>
                        {}
                               0.22210526 1.0000000
                                                        1.000000
                                                                   422
   [27]
          {,A-7}
##
                     =>
                        {A-9} 0.22210526 0.5710419
                                                        1.071056
                                                                   422
##
   [28]
          \{A-7, A-9\} => \{NA\} \quad 0.22210526 \quad 1.0000000
                                                        1.000000
                                                                   422
##
   [29]
          \{A-7,NA\}
                        {A-9} 0.22210526 0.5710419
                                                        1.071056
                                                                   422
   [30]
##
          \{Q-6\}
                     => {A-9} 0.21842105 0.5646259
                                                        1.059022
                                                                   415
   [31]
          \{A-9,Q-6\} =>
                               0.21842105 1.0000000
                                                        1.000000
##
                        {}
                                                                   415
   [32]
##
          \{,Q-6\}
                     => {A-9} 0.21842105 0.5646259
                                                        1.059022
                                                                   415
   [33]
          \{A-9,Q-6\} =>
                        {NA} 0.21842105 1.0000000
                                                        1.000000
   [34]
          {NA,Q-6}
                     => {A-9} 0.21842105 0.5646259
##
                                                        1.059022
                                                                   415
   [35]
          \{A-6\}
                               0.21631579 1.0000000
                                                        1.000000
##
                     =>
                        {}
                                                                   411
   [36]
                               0.21631579 1.0000000
##
          \{A-6\}
                        {NA}
                                                        1.000000
                                                                   411
   [37]
          \{,A-6\}
                        {NA}
                               0.21631579 1.0000000
                                                        1.000000
                                                                   411
   [38]
          \{A-6,NA\}
                               0.21631579 1.0000000
                                                        1.000000
##
                     =>
                        {}
                                                                   411
##
   [39]
          \{Q-6\}
                     =>
                        {A-8} 0.20210526 0.5224490
                                                        1.304406
                                                                   384
##
   [40]
          \{A-8\}
                     => {Q-6} 0.20210526 0.5045992
                                                        1.304406
                                                                   384
##
   [41]
          \{A-8,Q-6\} \Rightarrow \{\}
                               0.20210526 1.0000000
                                                        1.000000
                                                                   384
   [42]
          \{,Q-6\}
                        {A-8} 0.20210526 0.5224490
##
                     =>
                                                        1.304406
                                                                   384
##
   [43]
          \{,A-8\}
                        {Q-6} 0.20210526 0.5045992
                                                        1.304406
                                                                   384
##
   [44]
          \{A-8,Q-6\} =>
                        {NA}
                              0.20210526 1.0000000
                                                        1.000000
                                                                   384
##
   [45]
          \{NA,Q-6\}
                        {A-8} 0.20210526 0.5224490
                                                        1.304406
                                                                   384
##
   [46]
          \{A-8,NA\}
                        {Q-6} 0.20210526 0.5045992
                                                        1.304406
                                                                   384
                     =>
   [47]
                     =>
##
          {Q-8}
                        {}
                               0.18842105 1.0000000
                                                        1.000000
                                                                   358
##
  [48]
          {Q-8}
                        {NA}
                               0.18842105 1.0000000
                                                        1.000000
                                                                   358
## [49]
                     => {NA}
                               0.18842105 1.0000000
                                                        1.000000
                                                                   358
          {,Q-8}
## [50]
          \{NA,Q-8\}
                     => {}
                               0.18842105 1.0000000
                                                        1.000000
                                                                   358
```

```
## [51]
          \{A-8, A-9\} => \{\}
                                0.18421053 1.0000000
                                                          1.000000
                                                                      350
##
   [52]
          \{A-8, A-9\} => \{NA\}
                                0.18421053 1.0000000
                                                                     350
                                                          1.000000
   [53]
          {Q-5}
                      => {}
                                0.15894737 1.0000000
                                                          1.000000
                                                                      302
                                0.15894737 1.0000000
   [54]
                                                          1.000000
                                                                     302
##
          {Q-5}
                      =>
                        \{NA\}
##
   [55]
          \{,Q-5\}
                      => {NA}
                                0.15894737 1.0000000
                                                          1.000000
                                                                      302
   [56]
                                                          1.000000
                                                                     302
##
          \{NA,Q-5\}
                      => {}
                                0.15894737 1.0000000
                                                          1.000000
##
   [57]
          \{A-7,Q-6\} => \{\}
                                0.15894737 1.0000000
                                                                      302
##
   [58]
          \{A-7,Q-6\} => \{NA\}
                                0.15894737 1.0000000
                                                          1.000000
                                                                      302
##
   [59]
          \{A-7, A-8\} => \{\}
                                0.14368421 1.0000000
                                                          1.000000
                                                                      273
   [60]
##
          \{A-7, A-8\} => \{NA\}
                                0.14368421 1.0000000
                                                          1.000000
                                                                      273
##
   [61]
          {Q-7}
                      => {}
                                0.12736842 1.0000000
                                                          1.000000
                                                                      242
   [62]
          {Q-7}
                                0.12736842 1.0000000
                                                          1.000000
                                                                      242
##
                      => {NA}
##
   [63]
          \{,Q-7\}
                      => {NA}
                                0.12736842 1.0000000
                                                          1.000000
                                                                      242
   [64]
##
          \{NA,Q-7\}
                      =>
                         {}
                                0.12736842 1.0000000
                                                          1.000000
                                                                      242
   [65]
          {Q-8}
                      => {A-7} 0.12631579 0.6703911
                                                          1.723604
##
                                                                      240
##
   [66]
          \{A-7,Q-8\} \Rightarrow \{\}
                                0.12631579 1.0000000
                                                          1.000000
                                                                      240
   [67]
                                                                      240
##
          {,Q-8}
                      => {A-7} 0.12631579 0.6703911
                                                          1.723604
   [68]
          \{A-7,Q-8\} \Rightarrow \{NA\} \quad 0.12631579 \quad 1.0000000
                                                          1.000000
                                                                      240
   [69]
##
          \{NA,Q-8\}
                     => {A-7} 0.12631579 0.6703911
                                                          1.723604
                                                                      240
##
   [70]
          {Q-8}
                      => {A-9} 0.11578947 0.6145251
                                                          1.152614
                                                                      220
##
   [71]
          \{A-9,Q-8\} => \{\}
                                0.11578947 1.0000000
                                                          1.000000
                                                                      220
   [72]
                      => {A-9} 0.11578947 0.6145251
                                                                      220
##
          \{,Q-8\}
                                                          1.152614
   [73]
          \{A-9,Q-8\} => \{NA\}
                                                                      220
##
                                0.11578947 1.0000000
                                                          1.000000
          {NA,Q-8} \Rightarrow {A-9} 0.11578947 0.6145251
   [74]
                                                                      220
##
                                                          1.152614
   [75]
##
          \{A-8,Q-6\} \Rightarrow \{A-9\} \ 0.11052632 \ 0.5468750
                                                          1.025728
                                                                      210
   [76]
          \{A-9,Q-6\} \Rightarrow \{A-8\} \ 0.11052632 \ 0.5060241
                                                          1.263398
                                                                      210
   [77]
          \{A-8, A-9\} => \{Q-6\} \ 0.11052632 \ 0.6000000
                                                          1.551020
##
                                                                      210
          \{A-7,Q-6\} \Rightarrow \{A-9\} \ 0.09894737 \ 0.6225166
##
   [78]
                                                          1.167603
                                                                      188
   [79]
##
          \{A-6,Q-6\} => \{\}
                                0.09368421 1.0000000
                                                          1.000000
                                                                      178
##
   [80]
          \{A-6,Q-6\} \Rightarrow \{NA\} \quad 0.09368421 \quad 1.0000000
                                                          1.000000
                                                                     178
##
   [81]
          \{A-7,Q-6\} \Rightarrow \{A-8\} \ 0.09000000 \ 0.5662252
                                                          1.413703
                                                                      171
##
   [82]
          \{A-7, A-8\} => \{Q-6\} 0.09000000 0.6263736
                                                          1.619197
                                                                      171
##
   [83]
          \{A-7, A-8\} => \{A-9\} \ 0.08842105 \ 0.6153846
                                                          1.154226
                                                                      168
          \{A-6, A-8\} \Rightarrow \{\}
   [84]
                                0.07842105 1.0000000
##
                                                          1.000000
                                                                      149
   [85]
          \{A-6, A-8\} => \{NA\}
                                0.07842105 1.0000000
                                                          1.000000
                                                                      149
##
   [86]
                                0.07736842 1.0000000
                                                          1.000000
##
          \{A-8,Q-5\} => \{\}
                                                                      147
   [87]
          \{A-8,Q-5\} => \{NA\}
                                0.07736842 1.0000000
                                                          1.000000
                                                                      147
   [88]
          \{A-9,Q-5\} => \{\}
                                0.07631579 1.0000000
                                                          1.000000
                                                                      145
##
   [89]
          \{A-9,Q-5\} => \{NA\}
                                0.07631579 1.0000000
                                                          1.000000
                                                                      145
##
   [90]
          \{A-7,Q-8\} => \{A-9\} 0.07263158 0.5750000
                                                                      138
##
                                                          1.078480
          {A-9,Q-8} \Rightarrow {A-7} 0.07263158 0.6272727
   [91]
                                                          1.612744
                                                                      138
   [92]
          \{Q-4\}
                                0.07157895 1.0000000
                                                          1.000000
                                                                      136
##
                      => {}
   [93]
##
          \{Q-4\}
                      => {NA}
                                0.07157895 1.0000000
                                                          1.000000
                                                                      136
##
   [94]
          \{,Q-4\}
                      => {NA}
                                0.07157895 1.0000000
                                                          1.000000
                                                                      136
   [95]
##
          \{NA,Q-4\}
                      => {}
                                0.07157895 1.0000000
                                                          1.000000
                                                                      136
   [96]
          {Q-7}
                      => {A-9} 0.07000000 0.5495868
                                                          1.030814
                                                                      133
##
##
   [97]
          \{A-9,Q-7\} => \{\}
                                0.07000000 1.0000000
                                                          1.000000
                                                                      133
                      => {A-9} 0.07000000 0.5495868
##
   [98]
          \{,Q-7\}
                                                          1.030814
                                                                      133
   [99]
          \{A-9,Q-7\} => \{NA\}
                                0.07000000 1.0000000
                                                          1.000000
                                                                      133
   [100] {NA,Q-7} => {A-9} 0.07000000 0.5495868
                                                          1.030814
                                                                     133
scale_rules_dwq = fun.extract.rules (inputAddress = "../sequences/scale-nf-all-DWQ.txt",
                                           outputAddress = "result/scale dwg rules ga.csv",
                                           minsup = 0.0034, minconf = 0.5, window = 3)
```

```
## Apriori
##
  Parameter specification:
    confidence minval smax arem aval originalSupport maxtime
                                                                    support minlen
##
           0.5
                  0.1
                          1 none FALSE
                                                   TRUE
                                                             15 0.05356186
##
    maxlen target
                    ext
##
         3 rules FALSE
##
## Algorithmic control:
##
    filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
                                          TRUE
##
## Absolute minimum support count: 100
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[18 item(s), 1867 transaction(s)] done [0.00s].
## sorting and recoding items ... [11 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
    done [0.00s].
## writing ... [164 rule(s)] done [0.00s].
   creating S4 object ... done [0.00s].
##
         lhs
                             support
                      rhs
                                       confidence lift
## [1]
         {}
                   => {NA}
                             1.0000000 1.0000000
                                                   1.0000000 1867
##
  [2]
         {}
                   => {}
                             0.9994644 0.9994644
                                                   1.0000000 1866
## [3]
         {}
                   => {NA}
                             0.9994644 1.0000000
                                                   1.0000000 1866
  [4]
                   => {}
##
         {NA}
                             0.9994644 0.9994644
                                                   1.0000000 1866
   [5]
                   => {Q-8} 0.7996786 0.7996786
##
         {}
                                                   1.0000000 1493
##
   [6]
         {Q-8}
                   => {}
                             0.7996786 1.0000000
                                                   1.0005359 1493
## [7]
                   => {Q-8} 0.7996786 0.8001072
         {}
                                                   1.0005359 1493
## [8]
         {Q-8}
                   => {NA} 0.7996786 1.0000000
                                                   1.0000000 1493
## [9]
         {NA}
                   => {Q-8} 0.7996786 0.7996786
                                                   1.0000000 1493
                                                   1.0000000 1493
## [10]
                   => {NA} 0.7996786 1.0000000
         \{,Q-8\}
## [11]
         \{NA,Q-8\}
                   => {}
                             0.7996786 1.0000000
                                                   1.0005359 1493
## [12]
         \{,NA\}
                   => {Q-8} 0.7996786 0.8001072
                                                   1.0005359 1493
## [13]
         {}
                   => {A-7} 0.7386181 0.7386181
                                                   1.0000000 1379
## [14]
         \{A-7\}
                   => {NA} 0.7386181 1.0000000
                                                   1.0000000 1379
## [15]
         {NA}
                   => {A-7} 0.7386181 0.7386181
                                                   1.0000000 1379
## [16]
         \{A-7\}
                   => {}
                             0.7380825 0.9992748
                                                   0.9998104 1378
## [17]
        {}
                   => {A-7} 0.7380825 0.7384780
                                                   0.9998104 1378
## [18]
         \{,A-7\}
                   => {NA}
                            0.7380825 1.0000000
                                                   1.0000000 1378
## [19]
         \{A-7,NA\}
                   => {}
                             0.7380825 0.9992748
                                                   0.9998104 1378
## [20]
         {,NA}
                   => {A-7} 0.7380825 0.7384780
                                                   0.9998104 1378
## [21]
                   => {Q-6} 0.6454205 0.6454205
        {}
                                                   1.0000000 1205
## [22]
                   => {NA} 0.6454205 1.0000000
                                                   1.0000000 1205
         \{Q-6\}
## [23]
         {NA}
                   => {Q-6} 0.6454205 0.6454205
                                                   1.0000000 1205
## [24]
         {Q-6}
                             0.6448848 0.9991701
                   => {}
                                                   0.9997056 1204
## [25]
         {}
                   => {Q-6} 0.6448848 0.6452304
                                                   0.9997056 1204
                   => {NA} 0.6448848 1.0000000
## [26]
         \{,Q-6\}
                                                   1.0000000 1204
                             0.6448848 0.9991701 0.9997056 1204
## [27]
                   => {}
         \{NA,Q-6\}
```

```
## [28]
          {,NA}
                     => {Q-6} 0.6448848 0.6452304
                                                        0.9997056 1204
          \{A-7\}
                        {Q-8} 0.6416711 0.8687455
   [29]
##
                                                        1.0863682 1198
##
   [30]
          \{Q-8\}
                        {A-7} 0.6416711 0.8024113
                                                        1.0863682 1198
   [31]
          \{A-7,Q-8\} =>
                                0.6416711 1.0000000
##
                        {}
                                                        1.0005359 1198
##
   [32]
          \{,A-7\}
                        {Q-8} 0.6416711 0.8693759
                                                        1.0871566 1198
          \{,Q-8\}
##
   [33]
                     => {A-7} 0.6416711 0.8024113
                                                        1.0863682 1198
##
   [34]
          \{A-7,Q-8\} => \{NA\} \quad 0.6416711 \quad 1.0000000
                                                        1.0000000 1198
##
   [35]
          \{A-7,NA\}
                        {Q-8} 0.6416711 0.8687455
                                                        1.0863682 1198
##
   [36]
          \{NA,Q-8\}
                        {A-7} 0.6416711 0.8024113
                                                        1.0863682 1198
##
   [37]
          {}
                        {A-9} 0.5152651 0.5152651
                                                        1.0000000
                                                                    962
##
   [38]
          \{A-9\}
                        {}
                                0.5152651 1.0000000
                                                        1.0005359
                                                                    962
   [39]
##
          {}
                        {A-9} 0.5152651 0.5155413
                                                        1.0005359
                                                                    962
##
   [40]
          \{A-9\}
                        {NA}
                               0.5152651 1.0000000
                                                        1.0000000
                                                                    962
                         {A-9} 0.5152651 0.5152651
##
   [41]
          {NA}
                                                        1.0000000
                                                                    962
   [42]
##
          \{,A-9\}
                        {NA}
                               0.5152651 1.0000000
                                                        1.0000000
                                                                    962
##
   [43]
          \{A-9,NA\}
                     =>
                         {}
                                0.5152651 1.0000000
                                                        1.0005359
                                                                    962
   [44]
##
          {,NA}
                        {A-9} 0.5152651 0.5155413
                                                        1.0005359
                                                                    962
   [45]
          \{Q-6\}
                        {Q-8} 0.5136583 0.7958506
                                                        0.9952131
                                                                    959
##
##
   [46]
          {Q-8}
                     => {Q-6} 0.5136583 0.6423309
                                                        0.9952131
                                                                    959
##
   [47]
          \{Q-6,Q-8\} =>
                        {}
                                0.5136583 1.0000000
                                                        1.0005359
                                                                    959
##
   [48]
          {,Q-6}
                     => {Q-8} 0.5136583 0.7965116
                                                        0.9960397
                                                                    959
   [49]
          \{,Q-8\}
                     => {Q-6} 0.5136583 0.6423309
##
                                                        0.9952131
                                                                    959
   [50]
          {Q-6,Q-8} \Rightarrow {NA} 0.5136583 1.0000000
                                                        1.0000000
##
                                                                    959
##
   [51]
          \{NA,Q-6\}
                     => {Q-8} 0.5136583 0.7958506
                                                        0.9952131
                                                                    959
##
   [52]
          \{NA,Q-8\}
                     => {Q-6} 0.5136583 0.6423309
                                                        0.9952131
                                                                    959
   [53]
          {Q-6}
                     => {A-7} 0.5104446 0.7908714
                                                        1.0707446
                                                                    953
   [54]
          \{A-7\}
                     => {Q-6} 0.5104446 0.6910805
                                                        1.0707446
                                                                    953
##
##
   [55]
          \{A-7,Q-6\} => \{NA\} \quad 0.5104446 \quad 1.0000000
                                                        1.0000000
                                                                    953
   [56]
          \{NA,Q-6\}
                                                                    953
##
                     => {A-7} 0.5104446 0.7908714
                                                        1.0707446
   [57]
          \{A-7,NA\}
                     => {Q-6} 0.5104446 0.6910805
                                                        1.0707446
                                                                    953
##
##
   [58]
          \{A-7,Q-6\} => \{\}
                                0.5099089 0.9989507
                                                        0.9994860
                                                                    952
##
   [59]
          \{,Q-6\}
                     => {A-7} 0.5099089 0.7906977
                                                        1.0705095
                                                                    952
##
   [60]
          \{,A-7\}
                     => {Q-6} 0.5099089 0.6908563
                                                        1.0703973
                                                                    952
   [61]
          \{A-7,Q-6\} \Rightarrow \{Q-8\} \ 0.4429566 \ 0.8677859
                                                        1.0851684
                                                                    827
##
   [62]
          {Q-6,Q-8} \Rightarrow {A-7} 0.4429566 0.8623566
                                                        1.1675271
                                                                    827
##
##
   [63]
          \{A-7,Q-8\} \Rightarrow \{Q-6\} \ 0.4429566 \ 0.6903172
                                                        1.0695620
                                                                    827
##
   [64]
          \{A-9\}
                     => {Q-8} 0.4386717 0.8513514
                                                        1.0646169
   [65]
          {Q-8}
                     => {A-9} 0.4386717 0.5485599
##
                                                        1.0646169
                                                                    819
   [66]
          \{A-9,Q-8\} => \{\}
                                0.4386717 1.0000000
##
                                                        1.0005359
                                                                    819
##
   [67]
          \{,A-9\}
                     => {Q-8} 0.4386717 0.8513514
                                                        1.0646169
                                                                    819
##
   [68]
          \{,Q-8\}
                     => {A-9} 0.4386717 0.5485599
                                                        1.0646169
                                                                    819
   [69]
          \{A-9,Q-8\} => \{NA\}
                               0.4386717 1.0000000
##
                                                        1.0000000
                                                                    819
##
   [70]
          \{A-9,NA\}
                     => {Q-8} 0.4386717 0.8513514
                                                        1.0646169
                                                                    819
##
   [71]
          \{NA,Q-8\}
                     => {A-9} 0.4386717 0.5485599
                                                        1.0646169
                                                                    819
          \{A-9\}
##
   [72]
                     => {A-7} 0.4097483 0.7952183
                                                        1.0766298
                                                                    765
          \{A-7\}
   [73]
                        {A-9} 0.4097483 0.5547498
                                                                    765
##
                     =>
                                                        1.0766298
##
   [74]
          \{A-7, A-9\} => \{\}
                                0.4097483 1.0000000
                                                        1.0005359
                                                                    765
   [75]
##
          \{,A-9\}
                     => {A-7} 0.4097483 0.7952183
                                                        1.0766298
                                                                    765
##
   [76]
          \{,A-7\}
                     => {A-9} 0.4097483 0.5551524
                                                        1.0774111
                                                                    765
##
   [77]
          \{A-7, A-9\} =>
                        {NA}
                               0.4097483 1.0000000
                                                        1.0000000
                                                                    765
   [78]
##
          \{A-9,NA\}
                     => {A-7} 0.4097483 0.7952183
                                                        1.0766298
                                                                    765
##
   [79]
          \{A-7,NA\}
                     => {A-9} 0.4097483 0.5547498
                                                        1.0766298
                                                                    765
##
   [80]
          \{A-7, A-9\} => \{Q-8\} \ 0.3567220 \ 0.8705882
                                                        1.0886726
                                                                    666
## [81]
          \{A-9,Q-8\} \Rightarrow \{A-7\} \ 0.3567220 \ 0.8131868
                                                       1.1009571
```

```
\{A-7,Q-8\} \Rightarrow \{A-9\} \ 0.3567220 \ 0.5559265
                                                  1.0789136
## [83]
                   => {Q-6} 0.3395822 0.6590437
                                                               634
        {A-9}
                                                   1.0211075
                    => {A-9} 0.3395822 0.5261411
                                                    1.0211075
## [84]
         {Q-6}
## [85]
         \{A-9,Q-6\} \Rightarrow \{\}
                             0.3395822 1.0000000
                                                    1.0005359
## [86]
         \{,A-9\}
                    => {Q-6} 0.3395822 0.6590437
                                                    1.0211075
## [87]
        {,Q-6}
                    => {A-9} 0.3395822 0.5265781
                                                    1.0219556 634
## [88]
         \{A-9,Q-6\} => \{NA\} \quad 0.3395822 \quad 1.0000000
                                                    1.0000000 634
## [89]
         \{A-9,NA\} => \{Q-6\} \ 0.3395822 \ 0.6590437
                                                    1.0211075
                                                               634
## [90]
         \{NA,Q-6\} \Rightarrow \{A-9\} \ 0.3395822 \ 0.5261411
                                                    1.0211075
                                                               634
## [91]
         \{A-9,Q-6\} => \{A-7\} \ 0.2951259 \ 0.8690852
                                                   1.1766367
                                                               551
## [92]
        \{A-7, A-9\} => \{Q-6\} 0.2951259 0.7202614
                                                   1.1159569
                                                               551
## [93]
         \{A-7,Q-6\} \Rightarrow \{A-9\} \ 0.2951259 \ 0.5781742
                                                    1.1220907
                                                    1.0848206
## [94]
         \{A-9,Q-6\} => \{Q-8\} \ 0.2945903 \ 0.8675079
                                                               550
## [95]
         \{A-9,Q-8\} => \{Q-6\} 0.2945903 0.6715507
                                                    1.0404856 550
## [96]
         {Q-6,Q-8} \Rightarrow {A-9} 0.2945903 0.5735141
                                                    1.1130466 550
## [97]
        \{Q-7\}
                    => {}
                             0.2581682 1.0000000
                                                    1.0005359
                                                               482
## [98]
                    => {NA}
        {Q-7}
                             0.2581682 1.0000000
                                                    1.0000000
                                                               482
## [99] {,Q-7}
                    => {NA} 0.2581682 1.0000000
                                                   1.0000000
                                                               482
## [100] \{NA,Q-7\} => \{\}
                             0.2581682 1.0000000
                                                  1.0005359
                                                               482
scale_rules_all = fun.extract.rules (inputAddress = "../sequences/scale-nf-all.txt",
                                       outputAddress = "result/scale all rules ga.csv",
                                       minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
##
## Parameter specification:
    confidence minval smax arem aval originalSupport maxtime
                                                                     support minlen
##
           0.5
                   0.1
                          1 none FALSE
                                                    TRUE
                                                              15 0.02654632
    maxlen target
                     ext
##
         3 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                           TRUE
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[3783 item(s), 3767 transaction(s)] done [0.01s].
## sorting and recoding items ... [13 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
## done [0.00s].
## writing ... [43 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
##
        lhs
                            support
                                        confidence lift
                      rhs
                   => {A-7} 0.56225113 0.5622511 1.0000000 2118
## [1]
       {}
## [2] {}
                  => {A-9} 0.52428989 0.5242899 1.0000000 1975
```

```
## [3]
        {}
                    => {Q-6} 0.51499867 0.5149987 1.0000000 1940
## [4]
        \{Q-8\}
                    => {A-7} 0.38173613 0.7768774 1.3817266 1438
                    => {Q-8} 0.38173613 0.6789424
## [5]
        \{A-7\}
                                                      1.3817266 1438
                    => {A-7} 0.33315636 0.6469072
## [6]
        {Q-6}
                                                      1.1505663 1255
## [7]
        \{A-7\}
                    => {Q-6} 0.33315636 0.5925401
                                                       1.1505663 1255
## [8]
                    => {A-7} 0.31510486 0.6010127
        \{A-9\}
                                                      1.0689399 1187
## [9]
        {A-7}
                    => {A-9} 0.31510486 0.5604344
                                                      1.0689399 1187
## [10] {Q-6}
                    => {A-9} 0.27847093 0.5407216
                                                      1.0313410 1049
                    => {Q-6} 0.27847093 0.5311392
## [11] {A-9}
                                                      1.0313410 1049
## [12] {Q-8}
                    => {A-9} 0.27581630 0.5613182
                                                       1.0706257 1039
## [13] {A-9}
                    => {Q-8} 0.27581630 0.5260759
                                                       1.0706257 1039
                                                                   959
## [14] {Q-8}
                    => {Q-6} 0.25457924 0.5180983
                                                       1.0060188
## [15] \{Q-6,Q-8\} \Rightarrow \{A-7\} \ 0.21953809 \ 0.8623566
                                                       1.5337570
                                                                    827
## [16] \{A-7,Q-8\} \Rightarrow \{Q-6\} \ 0.21953809 \ 0.5751043
                                                       1.1167103 827
## [17] \{A-7,Q-6\} \Rightarrow \{Q-8\} \ 0.21953809 \ 0.6589641
                                                                    827
                                                       1.3410686
## [18] \{A-9,Q-8\} \Rightarrow \{A-7\} \ 0.21343244 \ 0.7738210
                                                       1.3762907
                                                                    804
## [19] \{A-7,Q-8\} \Rightarrow \{A-9\} \ 0.21343244 \ 0.5591099
                                                                    804
                                                       1.0664136
## [20] \{A-7, A-9\} \Rightarrow \{Q-8\} \ 0.21343244 \ 0.6773378
                                                       1.3784612
                                                                    804
## [21] \{A-9,Q-6\} \Rightarrow \{A-7\} \ 0.19617733 \ 0.7044805
                                                                   739
                                                       1.2529641
## [22] \{A-7,Q-6\} \Rightarrow \{A-9\} \ 0.19617733 \ 0.5888446
                                                       1.1231279
                                                                   739
## [23] \{A-7, A-9\} \Rightarrow \{Q-6\} \ 0.19617733 \ 0.6225779
                                                       1.2088923
                                                                   739
## [24] \{Q-6,Q-8\} \Rightarrow \{A-9\} \ 0.14600478 \ 0.5735141
                                                       1.0938874
## [25] \{A-9,Q-8\} \Rightarrow \{Q-6\} \ 0.14600478 \ 0.5293551
                                                       1.0278767
                                                                    550
## [26] \{A-9,Q-6\} \Rightarrow \{Q-8\} \ 0.14600478 \ 0.5243089
                                                       1.0670294
                                                                    550
## [27] {A-8}
                                                                    481
                   => {Q-6} 0.12768782 0.5268346
                                                       1.0229825
## [28] {Q-7}
                    => {A-9} 0.11043271 0.5745856
                                                       1.0959312
                                                                    416
## [29] {Q-7}
                    => {A-7} 0.10618529 0.5524862
                                                       0.9826324
                                                                    400
## [30] {A-6}
                    => {Q-6} 0.09822140 0.5117566
                                                       0.9937046
                                                                    370
## [31] \{A-9,Q-7\} \Rightarrow \{A-7\} \ 0.06264932 \ 0.5673077
                                                       1.0089934
                                                                    236
## [32] \{A-7,Q-7\} \Rightarrow \{A-9\} \ 0.06264932 \ 0.5900000
                                                       1.1253316
                                                                    236
## [33] \{A-8,A-9\} \Rightarrow \{Q-6\} \ 0.05972923 \ 0.5984043
                                                       1.1619530
                                                                    225
                                                       1.1857098
## [34] {Q-7,Q-8} \Rightarrow {A-7} 0.05680913 0.6666667
                                                                    214
## [35] \{A-7,Q-7\} \Rightarrow \{Q-8\} \ 0.05680913 \ 0.5350000
                                                       1.0887871
                                                                    214
## [36] \{A-7, A-8\} \Rightarrow \{Q-6\} 0.05123440 0.6126984
                                                       1.1897087
                                                                    193
## [37] {A-7,A-8} => {A-9} 0.04884523 0.5841270
                                                       1.1141298
                                                                    184
## [38] \{Q-7,Q-8\} \Rightarrow \{A-9\} \ 0.04698699 \ 0.5514019
                                                       1.0517118 177
## [39] \{A-6,A-7\} \Rightarrow \{Q-8\} \ 0.03424476 \ 0.5633188
                                                       1.1464191
## [40] {Q-5,Q-8} \Rightarrow {A-7} 0.03371383 0.7937500
                                                      1.4117357
                                                                    127
## [41] \{A-7,Q-5\} \Rightarrow \{Q-8\} \ 0.03371383 \ 0.5746606
                                                       1.1695011
## [42] {A-6,A-7} => {Q-6} 0.03371383 0.5545852 1.0768671
## [43] {A-6,A-9} => {Q-6} 0.03026281 0.5700000 1.1067990
prom_rules_swq = fun.extract.rules (inputAddress = "../sequences/prominence-nf-all-SWQ.txt",
                                         outputAddress = "result/prominence_swq_rules_qa.csv",
                                        minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
##
## Parameter specification:
    confidence minval smax arem aval originalSupport maxtime
##
                                                                         support minlen
##
                            1 none FALSE
                                                       TRUE
                                                                   15 0.03310162
            0.5
                    0.1
##
    maxlen target
                      ext
          3 rules FALSE
##
##
```

```
## Algorithmic control:
    filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
##
## Absolute minimum support count: 100
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16 item(s), 3021 transaction(s)] done [0.00s].
## sorting and recoding items ... [16 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
    done [0.00s].
##
   writing ... [141 rule(s)] done [0.00s].
   creating S4 object ... done [0.00s].
##
         lhs
                       rhs
                              support
                                          confidence lift
                                                                count
## [1]
                    => {NA}
                              1.00000000 1.0000000
         {}
                                                      1.000000 3021
   [2]
##
         {}
                    => {}
                              1.00000000 1.0000000
                                                      1.000000 3021
   [3]
##
         {NA}
                    => {}
                              1.00000000 1.0000000
                                                      1.000000 3021
##
   [4]
                              1.00000000 1.0000000
                                                      1.000000 3021
         {}
                    => {NA}
##
   [5]
         \{A-7\}
                    =>
                       {NA}
                              0.48063555 1.0000000
                                                      1.000000 1452
##
   [6]
         \{A-7\}
                    => {}
                              0.48063555 1.0000000
                                                      1.000000 1452
   [7]
##
         \{A-7,NA\}
                    => {}
                              0.48063555 1.0000000
                                                      1.000000 1452
##
  [8]
         \{,A-7\}
                    => {NA}
                              0.48063555 1.0000000
                                                      1.000000 1452
## [9]
         \{A-6\}
                    => {NA}
                              0.37073817 1.0000000
                                                      1.000000 1120
  [10]
                    => {}
##
         \{A-6\}
                              0.37073817 1.0000000
                                                      1.000000 1120
  [11]
         \{A-6,NA\}
                    => {}
                              0.37073817 1.0000000
                                                      1.000000 1120
   [12]
##
         \{,A-6\}
                    => {NA}
                              0.37073817 1.0000000
                                                      1.000000 1120
         \{A-5\}
##
   [13]
                    => {NA}
                              0.26580602 1.0000000
                                                      1.000000
                                                                 803
##
  [14]
         \{A-5\}
                    => {}
                              0.26580602 1.0000000
                                                      1.000000
                                                                 803
         \{A-5,NA\}
                    => {}
                                                      1.000000
## [15]
                              0.26580602 1.0000000
                                                                 803
         \{,A-5\}
## [16]
                    => {NA}
                              0.26580602 1.0000000
                                                      1.000000
                                                                 803
## [17]
         \{A-4\}
                    => {NA}
                              0.25521351 1.0000000
                                                      1.000000
                                                                 771
## [18]
         \{A-4\}
                    => {}
                              0.25521351 1.0000000
                                                      1.000000
                                                                 771
  Г197
         \{A-4,NA\}
                    => {}
                              0.25521351 1.0000000
                                                      1.000000
                                                                 771
  [20]
##
         \{,A-4\}
                    =>
                       {NA}
                              0.25521351 1.0000000
                                                      1.000000
                                                                 771
## [21]
         {Q-2}
                    => {NA}
                              0.23601456 1.0000000
                                                      1.000000
                                                                 713
## [22]
         {Q-2}
                    => {}
                              0.23601456 1.0000000
                                                      1.000000
                                                                 713
## [23]
         \{NA,Q-2\}
                    => {}
                              0.23601456 1.0000000
                                                      1.000000
                                                                 713
## [24]
         \{,Q-2\}
                    => {NA}
                              0.23601456 1.0000000
                                                      1.000000
                                                                 713
## [25]
         {Q-3}
                    => {NA}
                              0.23171135 1.0000000
                                                      1.000000
                                                                 700
##
  [26]
         {Q-3}
                    => {}
                              0.23171135 1.0000000
                                                      1.000000
                                                                 700
  [27]
                                                                 700
##
         \{NA,Q-3\}
                    => {}
                              0.23171135 1.0000000
                                                      1.000000
   [28]
         \{,Q-3\}
                       {NA}
                              0.23171135 1.0000000
                                                      1.000000
                                                                 700
##
##
  [29]
         \{A-3\}
                    => {NA}
                              0.19629262 1.0000000
                                                      1.000000
                                                                 593
## [30]
         \{A-3\}
                    => {}
                              0.19629262 1.0000000
                                                      1.000000
                                                                 593
## [31]
         \{A-3,NA\}
                    => {}
                              0.19629262 1.0000000
                                                      1.000000
                                                                 593
## [32]
         \{,A-3\}
                    => {NA}
                              0.19629262 1.0000000
                                                      1.000000
                                                                 593
## [33]
         \{A-2\}
                    => {NA}
                              0.15590864 1.0000000
                                                      1.000000
                                                                 471
  [34]
         \{A-2\}
                    => {}
                              0.15590864 1.0000000
                                                      1.000000
                                                                 471
```

1.000000

471

0.15590864 1.0000000

=> {}

 $\{A-2,NA\}$

[35]

```
[36]
          \{,A-2\}
                     => {NA}
                               0.15590864 1.0000000
                                                        1.000000
                                                                    471
##
   [37]
          {Q-4}
                                                                    459
                        {NA}
                               0.15193644 1.0000000
                                                        1.000000
##
   [38]
          \{Q-4\}
                        {}
                                0.15193644 1.0000000
                                                         1.000000
                                                                    459
   [39]
          {NA,Q-4}
                                0.15193644 1.0000000
                                                        1.000000
                                                                    459
##
                     =>
                        {}
##
   [40]
          {,Q-4}
                     =>
                        {NA}
                               0.15193644 1.0000000
                                                        1.000000
                                                                    459
   [41]
          {Q-6}
##
                        {NA}
                               0.13604767 1.0000000
                                                        1.000000
                                                                    411
                     =>
##
   [42]
          \{Q-6\}
                     =>
                        {}
                                0.13604767 1.0000000
                                                        1.000000
                                                                    411
##
   [43]
          \{NA,Q-6\}
                     =>
                        {}
                                0.13604767 1.0000000
                                                        1.000000
                                                                    411
##
   [44]
          \{,Q-6\}
                         {NA}
                               0.13604767 1.0000000
                                                        1.000000
                                                                    411
                     =>
##
   [45]
          \{A-4\}
                        {A-7} 0.13439259 0.5265888
                                                        1.095609
                                                                    406
##
   [46]
          \{A-4, A-7\} =>
                        {NA}
                               0.13439259 1.0000000
                                                        1.000000
                                                                    406
   [47]
                                                        1.095609
##
          \{A-4,NA\}
                     =>
                        {A-7} 0.13439259 0.5265888
                                                                    406
##
   [48]
          \{A-4, A-7\} =>
                        {}
                                0.13439259 1.0000000
                                                        1.000000
                                                                    406
          {,A-4}
   [49]
                        {A-7} 0.13439259 0.5265888
##
                     =>
                                                         1.095609
                                                                    406
   [50]
          \{A-5, A-7\} => \{NA\}
                               0.13108242 1.0000000
                                                        1.000000
##
                                                                    396
##
   [51]
          \{A-5, A-7\} => \{\}
                                0.13108242 1.0000000
                                                        1.000000
                                                                    396
   [52]
##
          \{A-6, A-7\} => \{NA\}
                               0.13008937 1.0000000
                                                        1.000000
                                                                    393
##
   [53]
          \{A-6, A-7\} => \{\}
                                0.13008937 1.0000000
                                                        1.000000
                                                                    393
   [54]
##
          \{Q-3\}
                     => {A-7} 0.11817279 0.5100000
                                                        1.061095
                                                                    357
##
   [55]
          \{A-7,Q-3\} =>
                        {NA}
                               0.11817279 1.0000000
                                                        1.000000
                                                                    357
##
   [56]
          {NA,Q-3}
                     =>
                        {A-7} 0.11817279 0.5100000
                                                        1.061095
                                                                    357
   [57]
          \{A-7,Q-3\} =>
                                0.11817279 1.0000000
                                                        1.000000
##
                        {}
                                                                    357
   [58]
          {,Q-3}
                        {A-7} 0.11817279 0.5100000
##
                                                        1.061095
                                                                    357
                     =>
   [59]
          {Q-5}
                                                                    333
##
                     =>
                        {NA}
                               0.11022840 1.0000000
                                                        1.000000
##
   [60]
          {Q-5}
                     =>
                        {}
                                0.11022840 1.0000000
                                                        1.000000
                                                                    333
   [61]
          {NA,Q-5}
                     =>
                        {}
                                0.11022840 1.0000000
                                                        1.000000
                                                                    333
   [62]
          {,Q-5}
                        {NA}
                               0.11022840 1.0000000
                                                        1.000000
                                                                    333
##
                     =>
##
   [63]
          \{A-7,Q-2\} =>
                        {NA}
                               0.10559417 1.0000000
                                                        1.000000
                                                                    319
   [64]
          \{A-7,Q-2\} =>
                        {}
                                0.10559417 1.0000000
                                                        1.000000
##
                                                                    319
##
   [65]
          {Q-1}
                     => {NA}
                               0.09433962 1.0000000
                                                        1.000000
                                                                    285
   [66]
##
          {Q-1}
                     =>
                        {}
                                0.09433962 1.0000000
                                                        1.000000
                                                                    285
##
   [67]
          {NA,Q-1}
                     => {}
                                0.09433962 1.0000000
                                                        1.000000
                                                                    285
##
   [68]
          {,Q-1}
                     => {NA}
                                0.09433962 1.0000000
                                                         1.000000
                                                                    285
   [69]
          \{A-6,Q-3\} => \{NA\}
##
                                0.09433962 1.0000000
                                                        1.000000
                                                                    285
   [70]
          \{A-6,Q-3\} => \{\}
                                0.09433962 1.0000000
                                                        1.000000
                                                                    285
##
          \{A-6,Q-2\} => \{NA\}
                                                                    285
##
   [71]
                               0.09433962 1.0000000
                                                        1.000000
##
   [72]
          \{A-6,Q-2\} => \{\}
                                0.09433962 1.0000000
                                                         1.000000
                                                                    285
   [73]
          \{A-4, A-6\} => \{NA\}
                               0.08341609 1.0000000
                                                        1.000000
                                                                    252
##
   [74]
          \{A-4, A-6\} => \{\}
                                0.08341609 1.0000000
                                                        1.000000
                                                                    252
##
   [75]
          {A-1}
##
                     => {NA}
                               0.08043694 1.0000000
                                                        1.000000
                                                                    243
##
   [76]
          \{A-1\}
                     => {}
                                0.08043694 1.0000000
                                                        1.000000
                                                                    243
   [77]
          \{A-1,NA\}
                        {}
                                0.08043694 1.0000000
                                                        1.000000
                                                                    243
##
                     =>
##
   [78]
          \{,A-1\}
                     =>
                        {NA}
                               0.08043694 1.0000000
                                                        1.000000
                                                                    243
##
   [79]
          \{Q-4\}
                        {A-7} 0.07745780 0.5098039
                                                        1.060687
                                                                    234
                     =>
##
   [80]
          \{A-7,Q-4\} =>
                        \{NA\}
                               0.07745780 1.0000000
                                                        1.000000
                                                                    234
   [81]
          \{NA,Q-4\}
                        {A-7} 0.07745780 0.5098039
                                                        1.060687
                                                                    234
##
                     =>
##
   [82]
          \{A-7,Q-4\} => \{\}
                                0.07745780 1.0000000
                                                        1.000000
                                                                    234
   [83]
                                                                    234
##
          \{,Q-4\}
                        {A-7} 0.07745780 0.5098039
                                                        1.060687
##
   [84]
          {Q-6}
                     => {A-7} 0.07679576 0.5644769
                                                        1.174438
                                                                    232
##
   [85]
          \{A-7,Q-6\} =>
                        {NA}
                               0.07679576 1.0000000
                                                        1.000000
                                                                    232
   [86]
          {NA,Q-6}
                                                                    232
##
                        {A-7} 0.07679576 0.5644769
                                                        1.174438
                     =>
##
   [87]
          \{A-7,Q-6\} =>
                        {}
                                0.07679576 1.0000000
                                                        1.000000
                                                                    232
##
   [88]
          \{,Q-6\}
                     => {A-7} 0.07679576 0.5644769
                                                        1.174438
                                                                    232
   [89]
          \{A-4,Q-3\} => \{NA\} \quad 0.07216154 \quad 1.0000000
                                                        1.000000
                                                                    218
```

```
## [90]
         \{A-4,Q-3\} => \{\}
                              0.07216154 1.0000000 1.000000
         \{A-5,A-6\} \Rightarrow \{NA\} \quad 0.07116849 \quad 1.0000000
## [91]
                                                      1.000000
                                                                 215
         \{A-5, A-6\} => \{\}
                                                      1.000000
## [92]
                              0.07116849 1.0000000
                                                                 215
         \{A-3,A-7\} \Rightarrow \{NA\} \quad 0.06885137 \quad 1.0000000
## [93]
                                                                208
                                                      1.000000
## [94]
         \{A-3, A-7\} => \{\}
                              0.06885137 1.0000000
                                                      1.000000
## [95]
         \{A-6,Q-4\} \Rightarrow \{NA\} \quad 0.06454816 \quad 1.0000000
                                                      1.000000 195
         \{A-6,Q-4\} \Rightarrow \{\}
## [96]
                              0.06454816 1.0000000
                                                      1.000000 195
         \{A-3, A-6\} => \{NA\}
## [97]
                              0.06322410 1.0000000
                                                      1.000000 191
## [98]
         \{A-3, A-6\} \Rightarrow \{\}
                              0.06322410 1.0000000
                                                      1.000000
                                                                 191
## [99]
         \{A-3,Q-2\} => \{NA\}
                              0.06190003 1.0000000
                                                      1.000000
                                                                 187
## [100] \{A-3,Q-2\} \Rightarrow \{\}
                              0.06190003 1.0000000
                                                      1.000000
                                                                 187
prom_rules_dwq = fun.extract.rules (inputAddress = "../sequences/prominence-nf-all-DWQ.txt",
                                       outputAddress = "result/prominence_dwq_rules_qa.csv",
                                       minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
##
## Parameter specification:
    confidence minval smax arem aval originalSupport maxtime
##
                                                                      support minlen
##
           0.5
                   0.1
                           1 none FALSE
                                                     TRUE
                                                               15 0.03478261
##
    maxlen target
                     ext
##
         3 rules FALSE
##
## Algorithmic control:
    filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                            TRIIE
##
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16 item(s), 2875 transaction(s)] done [0.00s].
## sorting and recoding items ... [16 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
    done [0.00s].
## writing ... [231 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
##
         lhs
                       rhs
                              support
                                         confidence lift
                                                                count
## [1]
         {}
                    => {NA}
                             1.0000000 1.0000000
                                                    1.0000000 2875
## [2]
         {}
                    => {}
                              0.9996522 0.9996522
                                                     1.0000000 2874
## [3]
         {}
                    => {NA} 0.9996522 1.0000000
                                                     1.0000000 2874
## [4]
         {NA}
                    => {}
                              0.9996522 0.9996522
                                                    1.0000000 2874
## [5]
                    => {Q-6} 0.5697391 0.5697391
         {}
                                                    1.0000000 1638
## [6]
         {Q-6}
                    => {}
                              0.5697391 1.0000000
                                                    1.0003479 1638
## [7]
                    => {Q-6} 0.5697391 0.5699374
         {}
                                                     1.0003479 1638
## [8]
         {Q-6}
                    => {NA} 0.5697391 1.0000000
                                                    1.0000000 1638
## [9]
                    => {Q-6} 0.5697391 0.5697391
         {NA}
                                                    1.0000000 1638
                    => {NA} 0.5697391 1.0000000
## [10]
        {,Q-6}
                                                    1.0000000 1638
```

```
## [11]
          \{NA,Q-6\}
                     => {}
                                0.5697391 1.0000000
                                                       1.0003479 1638
##
   [12]
          {,NA}
                        {Q-6} 0.5697391 0.5699374
                                                       1.0003479 1638
                     =>
                                                        1.0003479 1379
   [13]
          \{A-7\}
                        {}
                                0.4796522 1.0000000
          \{A-7\}
   [14]
                               0.4796522 1.0000000
##
                     =>
                        {NA}
                                                        1.0000000 1379
##
   [15]
          \{,A-7\}
                     =>
                        {NA}
                               0.4796522 1.0000000
                                                        1.0000000 1379
          \{A-7,NA\}
##
   [16]
                     =>
                         {}
                                0.4796522 1.0000000
                                                        1.0003479 1379
          \{A-4\}
##
   [17]
                     =>
                        {NA}
                               0.4671304 1.0000000
                                                       1.0000000 1343
          \{A-4\}
##
   [18]
                     =>
                        {}
                                0.4667826 0.9992554
                                                       0.9996031 1342
##
   Г197
          \{,A-4\}
                         {NA}
                               0.4667826 1.0000000
                                                        1.0000000 1342
                     =>
##
   [20]
          \{A-4,NA\}
                     =>
                        {}
                                0.4667826 0.9992554
                                                        0.9996031 1342
   [21]
          {Q-3}
                     =>
                        {}
                                0.4354783 1.0000000
                                                        1.0003479 1252
   [22]
          {Q-3}
##
                     =>
                        {NA}
                               0.4354783 1.0000000
                                                        1.0000000 1252
##
   [23]
          \{,Q-3\}
                        {NA}
                               0.4354783 1.0000000
                                                        1.0000000 1252
                     =>
                                                        1.0003479 1252
##
   [24]
          \{NA,Q-3\}
                     =>
                         {}
                                0.4354783 1.0000000
   [25]
          {Q-2}
                        {NA}
                               0.3593043 1.0000000
##
                     =>
                                                        1.0000000 1033
##
   [26]
          {Q-2}
                     =>
                        {}
                                0.3589565 0.9990319
                                                        0.9993796 1032
##
   [27]
          \{,Q-2\}
                        {NA}
                               0.3589565 1.0000000
                                                        1.0000000 1032
                     =>
   [28]
          \{NA,Q-2\}
                     => {}
                                0.3589565 0.9990319
                                                        0.9993796 1032
##
   [29]
          \{A-4\}
                        {Q-6} 0.3133913 0.6708861
                                                       1.1775320
                                                                    901
##
   [30]
          \{Q-6\}
                     => {A-4} 0.3133913 0.5500611
                                                        1.1775320
                                                                    901
##
   [31]
          \{A-4,Q-6\} => \{\}
                               0.3133913 1.0000000
                                                        1.0003479
                                                                    901
   [32]
          \{,A-4\}
                     => {Q-6} 0.3133913 0.6713860
                                                        1.1784095
##
                                                                    901
   [33]
          {,Q-6}
                     => {A-4} 0.3133913 0.5500611
                                                        1.1775320
                                                                    901
##
   [34]
          \{A-4,Q-6\} => \{NA\} \quad 0.3133913 \quad 1.0000000
##
                                                       1.0000000
                                                                    901
##
   [35]
          \{A-4,NA\}
                     => {Q-6} 0.3133913 0.6708861
                                                       1.1775320
                                                                    901
   [36]
          \{NA,Q-6\}
                     => {A-4} 0.3133913 0.5500611
                                                       1.1775320
                                                                    901
   [37]
          \{A-7\}
                        {Q-6} 0.2845217 0.5931835
                                                        1.0411492
##
                     =>
                                                                    818
          \{A-7,Q-6\} \Rightarrow \{\}
##
   [38]
                               0.2845217 1.0000000
                                                       1.0003479
                                                                    818
   [39]
          \{,A-7\}
                     => {Q-6} 0.2845217 0.5931835
##
                                                        1.0411492
                                                                    818
   [40]
          \{A-7,Q-6\} =>
                        {NA} 0.2845217 1.0000000
                                                        1.0000000
##
                                                                    818
##
   [41]
          \{A-7,NA\}
                     =>
                        {Q-6} 0.2845217 0.5931835
                                                        1.0411492
                                                                    818
##
   [42]
          \{A-5\}
                     => {}
                                0.2765217 1.0000000
                                                        1.0003479
                                                                    795
##
   [43]
          \{A-5\}
                        {NA}
                               0.2765217 1.0000000
                                                        1.0000000
                                                                    795
   [44]
          \{,A-5\}
                        {NA}
                               0.2765217 1.0000000
                                                        1.0000000
                                                                    795
##
                     =>
   [45]
          \{A-5,NA\}
                         {}
                                0.2765217 1.0000000
                                                        1.0003479
                                                                    795
##
                     =>
   [46]
          {Q-7}
##
                     =>
                        {}
                                0.2636522 1.0000000
                                                       1.0003479
                                                                    758
##
   [47]
          \{Q-7\}
                         {NA}
                               0.2636522 1.0000000
                                                        1.0000000
                                                                    758
   [48]
          {,Q-7}
                               0.2636522 1.0000000
                                                        1.000000
##
                     =>
                        {NA}
                                                                    758
   [49]
          {NA,Q-7}
                                0.2636522 1.0000000
                                                        1.0003479
                                                                    758
##
                     =>
                         {}
   [50]
          \{A-4\}
                        {A-7} 0.2497391 0.5346240
##
                                                        1.1146076
                                                                    718
                     =>
          \{A-7\}
##
   [51]
                        {A-4} 0.2497391 0.5206672
                                                        1.1146076
                                                                    718
   [52]
          \{A-4, A-7\} =>
                               0.2497391 1.0000000
                                                       1.0003479
##
                        {}
                                                                    718
##
   [53]
          \{,A-4\}
                     =>
                        {A-7} 0.2497391 0.5350224
                                                       1.1154382
                                                                    718
##
   [54]
          \{,A-7\}
                     => {A-4} 0.2497391 0.5206672
                                                        1.1146076
                                                                    718
##
   [55]
          \{A-4, A-7\} => \{NA\} \quad 0.2497391 \quad 1.0000000
                                                       1.0000000
                                                                    718
   [56]
          \{A-4,NA\}
                        {A-7} 0.2497391 0.5346240
##
                     =>
                                                        1.1146076
                                                                    718
##
   [57]
          \{A-7,NA\}
                     => {A-4} 0.2497391 0.5206672
                                                       1.1146076
                                                                    718
##
   [58]
          \{Q-3\}
                     => {Q-6} 0.2281739 0.5239617
                                                        0.9196519
                                                                    656
##
   [59]
          {Q-3,Q-6} \Rightarrow {}
                               0.2281739 1.0000000
                                                       1.0003479
                                                                    656
##
   [60]
          \{,Q-3\}
                        {Q-6} 0.2281739 0.5239617
                                                       0.9196519
                                                                    656
          {Q-3,Q-6} \Rightarrow {NA}
##
   [61]
                              0.2281739 1.0000000
                                                       1.0000000
                                                                    656
##
   [62]
          \{NA,Q-3\}
                        {Q-6} 0.2281739 0.5239617
                                                       0.9196519
                                                                    656
##
  [63]
          \{A-3\}
                     => {NA}
                               0.2208696 1.0000000
                                                       1.0000000
                                                                    635
## [64]
          \{A-3\}
                     => {}
                               0.2205217 0.9984252
                                                       0.9987726
                                                                    634
```

```
## [65]
          \{A-3\}
                     => {NA}
                               0.2205217 1.0000000
                                                       1.0000000
                                                                    634
##
   [66]
                               0.2205217 0.9984252
                                                                    634
          \{A-3, NA\} => \{\}
                                                       0.9987726
  [67]
          \{A-7,Q-3\} => \{\}
                               0.2156522 1.0000000
                                                       1.0003479
                                                                    620
## [68]
          \{A-7,Q-3\} => \{NA\}
                               0.2156522 1.0000000
                                                       1.0000000
                                                                    620
##
   [69]
          \{A-4,Q-3\} \Rightarrow \{\}
                               0.2118261 1.0000000
                                                       1.0003479
                                                                    609
## [70]
          \{A-4,Q-3\} => \{NA\} \quad 0.2118261 \quad 1.0000000
                                                       1.0000000
                                                                    609
## [71]
                     => {Q-6} 0.1982609 0.5517909
          \{0-2\}
                                                       0.9684975
## [72]
          {Q-2,Q-6} \Rightarrow {}
                               0.1982609 1.0000000
                                                       1.0003479
                                                                    570
## [73]
          \{,Q-2\}
                     => {Q-6} 0.1982609 0.5523256
                                                       0.9694359
                                                                    570
## [74]
          {Q-2,Q-6} \Rightarrow {NA} 0.1982609 1.0000000
                                                       1.0000000
                                                                    570
## [75]
          {NA,Q-2} \Rightarrow {Q-6} 0.1982609 0.5517909
                                                       0.9684975
                                                                    570
## [76]
                     => {A-4} 0.1805217 0.5024201
                                                       1.0755457
          \{Q-2\}
                                                                    519
## [77]
          \{A-4,Q-2\} => \{NA\} \quad 0.1805217 \quad 1.0000000
                                                       1.0000000
                                                                    519
          {NA,Q-2} \Rightarrow {A-4} 0.1805217 0.5024201
## [78]
                                                       1.0755457
                                                                    519
## [79]
          \{A-4,Q-2\} \Rightarrow \{\}
                               0.1801739 0.9980732
                                                       0.9984205
                                                                    518
## [80]
          {,Q-2}
                     => {A-4} 0.1801739 0.5019380
                                                       1.0745136
                                                                    518
## [81]
          \{A-7,Q-2\} \Rightarrow \{\}
                               0.1770435 1.0000000
                                                       1.0003479
                                                                    509
## [82]
          \{A-7,Q-2\} => \{NA\}
                               0.1770435 1.0000000
                                                       1.0000000
                                                                    509
## [83]
          \{Q-4\}
                               0.1718261 1.0000000
                                                       1.0003479
                                                                    494
                     => {}
## [84]
          \{Q-4\}
                     => {NA}
                               0.1718261 1.0000000
                                                       1.0000000
                                                                    494
## [85]
         \{,Q-4\}
                     => {NA}
                               0.1718261 1.0000000
                                                       1.0000000
                                                                    494
## [86]
          \{NA,Q-4\}
                     => {}
                               0.1718261 1.0000000
                                                       1.0003479
## [87]
          \{A-4,A-7\} \Rightarrow \{Q-6\} \ 0.1680000 \ 0.6727019
                                                                    483
                                                       1.1807192
## [88]
          \{A-4,Q-6\} \Rightarrow \{A-7\} \ 0.1680000 \ 0.5360710
                                                       1.1176245
                                                                    483
## [89]
          \{A-7,Q-6\} \Rightarrow \{A-4\} \ 0.1680000 \ 0.5904645
                                                                    483
                                                       1.2640250
## [90]
         {A-6}
                     => {}
                               0.1568696 1.0000000
                                                       1.0003479
                                                                    451
## [91]
         \{A-6\}
                     => {NA}
                               0.1568696 1.0000000
                                                       1.0000000
                                                                    451
## [92]
                     => {NA}
                                                       1.0000000
         \{,A-6\}
                              0.1568696 1.0000000
                                                                    451
## [93]
         \{A-6,NA\}
                     => {}
                               0.1568696 1.0000000
                                                       1.0003479
                                                                    451
## [94]
         \{A-2\}
                     => {NA}
                               0.1547826 1.0000000
                                                       1.0000000
                                                                    445
## [95]
         \{A-2\}
                     => {}
                               0.1544348 0.9977528
                                                       0.9981000
                                                                    444
## [96]
         \{,A-2\}
                     => {NA}
                               0.1544348 1.0000000
                                                       1.0000000
                                                                    444
## [97]
          \{A-2,NA\}
                     => {}
                               0.1544348 0.9977528
                                                       0.9981000
                                                                    444
## [98]
          \{A-5,Q-6\} \Rightarrow \{\}
                               0.1360000 1.0000000
                                                                    391
                                                       1.0003479
## [99]
          \{A-5,Q-6\} => \{NA\} \quad 0.1360000 \quad 1.0000000
                                                       1.0000000
                                                                    391
## [100] \{A-4,Q-3\} \Rightarrow \{Q-6\} \ 0.1349565 \ 0.6371100
                                                                    388
                                                       1.1182487
type_rules_swq = fun.extract.rules (inputAddress = "../sequences/type-nf-all-SWQ.txt",
                                         outputAddress = "result/type_swq_rules_qa.csv",
                                        minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
##
## Parameter specification:
##
    confidence minval smax arem aval originalSupport maxtime
                                                                        support minlen
##
                                                                  15 0.0310752
            0.5
                    0.1
                            1 none FALSE
                                                       TRUE
##
    maxlen target
                      ext
##
          3 rules FALSE
##
## Algorithmic control:
    filter tree heap memopt load sort verbose
       0.1 TRUE TRUE FALSE TRUE
##
                                              TRUE
##
## Absolute minimum support count: 100
```

```
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[348 item(s), 3218 transaction(s)] done [0.00s].
## sorting and recoding items ... [21 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
  checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
    done [0.00s].
   writing ... [117 rule(s)] done [0.00s].
   creating S4 object
                        ... done [0.00s].
##
         lhs
                            rhs
                                   support
                                               confidence lift
                                                                     count
   [1]
                                                           1.000000 3218
         {}
                        => {}
                                   1.00000000 1.0000000
   [2]
##
         {}
                        => {NA}
                                   1.00000000 1.0000000
                                                           1.000000 3218
   [3]
##
         {}
                        => {NA}
                                   1.00000000 1.0000000
                                                           1.000000 3218
   [4]
##
                        => {}
                                   1.00000000 1.0000000
                                                           1.000000 3218
         {NA}
  [5]
##
         {PCLI}
                        => {}
                                   0.41423244 1.0000000
                                                           1.000000 1333
## [6]
                        => {NA}
         {PCLI}
                                   0.41423244 1.0000000
                                                           1.000000 1333
                                                           1.000000 1333
##
  [7]
         {,PCLI}
                        => {NA}
                                   0.41423244 1.0000000
  [8]
##
         {NA,PCLI}
                        => {}
                                   0.41423244 1.0000000
                                                           1.000000 1333
  [9]
         {ADM2}
                                   0.34897452 1.0000000
                        => {}
                                                           1.000000 1123
##
   [10]
         {ADM2}
                        =>
                           {NA}
                                   0.34897452 1.0000000
                                                           1.000000 1123
## [11]
         {,ADM2}
                        => {NA}
                                   0.34897452 1.0000000
                                                           1.000000 1123
## [12]
         {ADM2,NA}
                        => {}
                                   0.34897452 1.0000000
                                                           1.000000 1123
## [13]
         {ADM1}
                        => {}
                                   0.33903045 1.0000000
                                                           1.000000 1091
## [14]
         {ADM1}
                        => {NA}
                                   0.33903045 1.0000000
                                                           1.000000 1091
##
  [15]
         {,ADM1}
                        => {NA}
                                   0.33903045 1.0000000
                                                           1.000000 1091
         {ADM1,NA}
   [16]
                        => {}
                                   0.33903045 1.0000000
                                                           1.000000 1091
   [17]
         {ADM2,PCLI}
                        => {}
                                   0.17060286 1.0000000
                                                           1.000000
                                                                      549
##
   [18]
         {ADM2,PCLI}
                        => {NA}
                                   0.17060286 1.0000000
                                                           1.000000
                                                                      549
##
  [19]
         {Q-PPL}
                        => {}
                                   0.14232443 1.0000000
                                                           1.000000
                                                                      458
  [20]
         {Q-PPL}
                                                           1.000000
                        => {NA}
                                   0.14232443 1.0000000
                                                                      458
## [21]
         {,Q-PPL}
                        => {NA}
                                   0.14232443 1.0000000
                                                           1.000000
                                                                      458
## [22]
         {NA,Q-PPL}
                        => {}
                                   0.14232443 1.0000000
                                                           1.000000
                                                                      458
## [23]
         {ADM1,PCLI}
                        => {}
                                   0.14014916 1.0000000
                                                           1.000000
                                                                      451
  [24]
         {ADM1,PCLI}
                        => {NA}
                                   0.14014916 1.0000000
                                                           1.000000
                                                                      451
  [25]
         {ADM1,ADM2}
                        => {}
                                   0.13020510 1.0000000
                                                           1.000000
                                                                      419
## [26]
         {ADM1,ADM2}
                        => {NA}
                                   0.13020510 1.0000000
                                                           1.000000
                                                                      419
## [27]
         {Q-ADM1}
                        => {}
                                   0.11280298 1.0000000
                                                           1.000000
## [28]
         {Q-ADM1}
                        => {NA}
                                   0.11280298 1.0000000
                                                           1.000000
                                                                      363
## [29]
         \{,Q-ADM1\}
                        => {NA}
                                   0.11280298 1.0000000
                                                           1.000000
                                                                      363
##
  [30]
                        =>
                           {}
         {NA,Q-ADM1}
                                   0.11280298 1.0000000
                                                           1.000000
                                                                      363
  [31]
         {Q-ADM2}
                        =>
                           {}
                                   0.10006215 1.0000000
                                                           1.000000
                                                                      322
  [32]
         {Q-ADM2}
                        =>
                           {NA}
                                   0.10006215 1.0000000
                                                           1.000000
                                                                      322
   [33]
         \{,Q-ADM2\}
                           {NA}
                                   0.10006215 1.0000000
                                                           1.000000
                                                                      322
                        =>
  [34]
                        => {}
##
         {NA,Q-ADM2}
                                   0.10006215 1.0000000
                                                           1.000000
                                                                      322
  [35]
         {PPL}
                                                           1.000000
                        => {}
                                   0.08514605 1.0000000
                                                                      274
## [36]
         {PPL}
                        => {NA}
                                   0.08514605 1.0000000
                                                           1.000000
                                                                      274
## [37]
                        => {NA}
                                                           1.000000
         {,PPL}
                                   0.08514605 1.0000000
                                                                      274
## [38]
                        => {}
                                   0.08514605 1.0000000
                                                           1.000000
                                                                      274
         {NA,PPL}
  [39]
         {RGN}
                        => {}
                                   0.07582349 1.0000000
                                                           1.000000
                                                                      244
  [40]
                        => {NA}
                                   0.07582349 1.0000000
##
         {RGN}
                                                           1.000000
                                                                      244
```

```
## [41]
          {,RGN}
                         => {NA}
                                    0.07582349 1.0000000
                                                             1.000000
          {NA,RGN}
##
   [42]
                            {}
                                    0.07582349 1.0000000
                                                             1.000000
                                                                        244
                         =>
                            {ADM2} 0.07271597 0.6446281
   [43]
          {Q-ADM1}
                                                             1.847207
                                                                        234
   [44]
          \{ADM2, Q-ADM1\} => \{\}
                                    0.07271597 1.0000000
                                                                        234
##
                                                             1.000000
##
   [45]
          \{,Q-ADM1\}
                         => {ADM2} 0.07271597 0.6446281
                                                             1.847207
                                                                        234
##
   [46]
          \{ADM2,Q-ADM1\} => \{NA\}
                                    0.07271597 1.0000000
                                                             1.000000
                                                                        234
##
   [47]
          {NA,Q-ADM1}
                         => {ADM2} 0.07271597 0.6446281
                                                             1.847207
                                                                        234
##
   [48]
          {HTL}
                         => {}
                                    0.07240522 1.0000000
                                                             1.000000
                                                                        233
##
   [49]
          {HTL}
                            {NA}
                                    0.07240522 1.0000000
                                                             1.000000
                                                                        233
                         =>
##
   [50]
          {,HTL}
                         =>
                            {NA}
                                    0.07240522 1.0000000
                                                             1.000000
                                                                        233
##
   [51]
          {HTL,NA}
                            {}
                                    0.07240522 1.0000000
                                                             1.000000
                                                                        233
                         =>
   [52]
                                                                        226
##
          {ADM1,ADM2}
                         =>
                            {PCLI} 0.07022996 0.5393795
                                                             1.302118
##
   [53]
          {ADM1,PCLI}
                         => {ADM2} 0.07022996 0.5011086
                                                             1.435946
                                                                        226
##
   [54]
          {Q-ADM1}
                         => {PCLI} 0.06556868 0.5812672
                                                             1.403239
                                                                        211
   [55]
          {PCLI,Q-ADM1} => {}
                                                             1.000000
##
                                    0.06556868 1.0000000
                                                                        211
##
   [56]
          {,Q-ADM1}
                         => {PCLI} 0.06556868 0.5812672
                                                             1.403239
                                                                        211
##
   [57]
          \{PCLI, Q-ADM1\} => \{NA\}
                                    0.06556868 1.0000000
                                                             1.000000
                                                                        211
   [58]
          {NA,Q-ADM1}
                         => {PCLI} 0.06556868 0.5812672
                                                             1.403239
                                                                        211
   [59]
          {ADM2,Q-PPL}
                                    0.06432567 1.0000000
                                                             1.000000
                                                                        207
##
                         => {}
##
   [60]
          {ADM2,Q-PPL}
                         => {NA}
                                    0.06432567 1.0000000
                                                             1.000000
                                                                        207
##
   [61]
          {AREA}
                         => {}
                                    0.05842138 1.0000000
                                                             1.000000
                                                                        188
   [62]
          {AREA}
                                    0.05842138 1.0000000
                                                             1.000000
##
                            {NA}
                                                                        188
   [63]
          {,AREA}
                         => {NA}
                                    0.05842138 1.0000000
                                                             1.000000
                                                                        188
##
   [64]
          {AREA, NA}
##
                         => {}
                                    0.05842138 1.0000000
                                                             1.000000
                                                                        188
##
   [65]
          {ADM1,Q-PPL}
                         => {}
                                    0.05624612 1.0000000
                                                             1.000000
                                                                        181
   [66]
          {ADM1,Q-PPL}
                         => {NA}
                                    0.05624612 1.0000000
                                                             1.000000
                                                                        181
   [67]
          {PCLI,Q-PPL}
                         => {}
                                    0.05469236 1.0000000
                                                                        176
##
                                                             1.000000
##
   [68]
          {PCLI,Q-PPL}
                         => {NA}
                                    0.05469236 1.0000000
                                                             1.000000
                                                                        176
   [69]
          {Q-ADM2}
                         => {PCLI} 0.05220634 0.5217391
##
                                                             1.259532
                                                                        168
##
   [70]
          \{PCLI, Q-ADM2\} => \{\}
                                    0.05220634 1.0000000
                                                             1.000000
                                                                        168
##
   [71]
          \{,Q-ADM2\}
                         => {PCLI} 0.05220634 0.5217391
                                                             1.259532
                                                                        168
##
   [72]
          \{PCLI, Q-ADM2\} => \{NA\}
                                    0.05220634 1.0000000
                                                             1.000000
                                                                        168
   [73]
          {NA,Q-ADM2}
                            {PCLI} 0.05220634 0.5217391
                                                             1.259532
                                                                        168
   [74]
          {STM}
                            {}
                                    0.04536979 1.0000000
                                                             1.000000
                                                                        146
##
                         =>
   [75]
          {STM}
                            {NA}
                                    0.04536979 1.0000000
                                                             1.000000
                                                                        146
##
##
   [76]
          {,STM}
                         => {NA}
                                    0.04536979 1.0000000
                                                             1.000000
                                                                        146
   [77]
          {NA,STM}
                         =>
                            {}
                                    0.04536979 1.0000000
                                                             1.000000
                                                                        146
   [78]
          {Q-PCLI}
                                    0.04350528 1.0000000
                                                             1.000000
##
                         =>
                            {}
                                                                        140
   [79]
          {Q-PCLI}
                            {NA}
                                    0.04350528 1.0000000
                                                             1.000000
##
                         =>
                                                                        140
   [80]
##
          {,Q-PCLI}
                            {NA}
                                    0.04350528 1.0000000
                                                             1.000000
                                                                        140
                         =>
   [81]
          {NA,Q-PCLI}
                         =>
                            {}
                                    0.04350528 1.0000000
                                                             1.000000
                                                                        140
   [82]
                                    0.04319453 1.0000000
                                                             1.000000
##
          {ADM3}
                         =>
                            {}
                                                                        139
##
   [83]
          {ADM3}
                         =>
                            {NA}
                                    0.04319453 1.0000000
                                                             1.000000
                                                                        139
##
   [84]
          {,ADM3}
                            {NA}
                                    0.04319453 1.0000000
                                                             1.000000
                                                                        139
                         =>
##
   [85]
          {ADM3,NA}
                         => {}
                                    0.04319453 1.0000000
                                                             1.000000
                                                                        139
          \{Q-\}
   [86]
                            {}
                                                                        136
##
                         =>
                                    0.04226227 1.0000000
                                                             1.000000
##
   [87]
          {Q-}
                         =>
                            {NA}
                                    0.04226227 1.0000000
                                                             1.000000
                                                                        136
##
   [88]
          \{,Q-\}
                         =>
                            {NA}
                                    0.04226227 1.0000000
                                                             1.000000
                                                                        136
##
   [89]
          \{NA,Q-\}
                         =>
                            {}
                                    0.04226227 1.0000000
                                                             1.000000
                                                                        136
##
   [90]
          {Q-ADM3}
                         =>
                            {}
                                    0.04164077 1.0000000
                                                             1.000000
                                                                        134
   [91]
##
          {Q-ADM3}
                            {NA}
                                    0.04164077 1.0000000
                                                             1.000000
                                                                        134
                         =>
##
   [92]
          {,Q-ADM3}
                         => {NA}
                                    0.04164077 1.0000000
                                                             1.000000
                                                                        134
##
  [93]
          {NA,Q-ADM3}
                         => {}
                                    0.04164077 1.0000000
                                                             1.000000
                                                                        134
## [94]
          {LCTY}
                         => {}
                                    0.04008701 1.0000000
                                                             1.000000
```

```
## [96]
        {,LCTY}
                       => {NA}
                                 0.04008701 1.0000000 1.000000
                                                                  129
        {LCTY, NA}
## [97]
                       => {}
                                 0.04008701 1.0000000
                                                        1.000000
                                                                  129
## [98]
         \{ADM2, Q-ADM1\} => \{PCLI\} 0.03977626 0.5470085
                                                        1.320535
                                                                  128
         \{PCLI, Q-ADM1\} => \{ADM2\} 0.03977626 0.6066351
                                                        1.738336
## [100] \{ADM1, Q-ADM2\} => \{\}
                                 0.03853325 1.0000000
                                                      1.000000
                                                                 124
type_rules_dwq = fun.extract.rules (inputAddress = "../sequences/type-nf-all-DWQ.txt",
                                    outputAddress = "result/type_dwq_rules_qa.csv",
                                    minsup = 0.0034, minconf = 0.5, window = 3)
## Apriori
## Parameter specification:
   confidence minval smax arem aval originalSupport maxtime
                                                                  support minlen
##
                  0.1
                         1 none FALSE
                                                 TRUE
                                                            15 0.03463803
##
   maxlen target
                    ext
##
         3 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
                                         TRUE
##
## Absolute minimum support count: 100
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[253 item(s), 2887 transaction(s)] done [0.00s].
## sorting and recoding items ... [15 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3
## Warning in apriori(trans1, parameter = list(support = 100/trans1@data@Dim[2], :
## Mining stopped (maxlen reached). Only patterns up to a length of 3 returned!
## done [0.00s].
## writing ... [164 rule(s)] done [0.00s].
## creating S4 object ... done [0.00s].
##
         lhs
                            rhs
                                     support
                                                confidence lift
## [1]
         {}
                         => {NA}
                                     1.00000000 1.0000000 1.0000000 2887
## [2]
        {}
                         => {}
                                     0.99965362 0.9996536 1.0000000 2886
## [3]
        {}
                         => {NA}
                                     0.99965362 1.0000000 1.0000000 2886
## [4]
                         => {}
         {NA}
                                     0.99965362 0.9996536 1.0000000 2886
## [5]
         {}
                         => {Q-ADM1} 0.69137513 0.6913751 1.0000000 1996
## [6]
         {Q-ADM1}
                         => {}
                                     0.69137513 1.0000000
                                                           1.0003465 1996
## [7]
                         => {Q-ADM1} 0.69137513 0.6916147 1.0003465 1996
         {}
## [8]
         {Q-ADM1}
                         => {NA}
                                     0.69137513 1.0000000 1.0000000 1996
## [9]
                         => {Q-ADM1} 0.69137513 0.6913751 1.0000000 1996
         {NA}
## [10]
        \{,Q-ADM1\}
                         => {NA}
                                     0.69137513 1.0000000 1.0000000 1996
                         => {}
## [11]
        {NA,Q-ADM1}
                                     0.69137513 1.0000000 1.0003465 1996
## [12]
        {,NA}
                         => {Q-ADM1} 0.69137513 0.6916147
                                                           1.0003465 1996
## [13]
        {}
                         => {ADM2}
                                     0.68063734 0.6806373 1.0000000 1965
## [14]
                        => {NA}
                                     0.68063734 1.0000000 1.0000000 1965
        {ADM2}
                         => {ADM2}
                                     0.68063734 0.6806373 1.0000000 1965
## [15]
        {NA}
```

0.04008701 1.0000000 1.000000 129

[95] {LCTY}

=> {NA}

```
## [16]
         {ADM2}
                              {}
                                        0.68029096 0.9994911
                                                               0.9998374 1964
##
   Γ17]
         {}
                              {ADM2}
                                        0.68029096 0.6805267
                                                               0.9998374 1964
   [18]
         {,ADM2}
                              {NA}
                                        0.68029096 1.0000000
                                                               1.0000000 1964
         {ADM2,NA}
   [19]
                                        0.68029096 0.9994911
                                                               0.9998374 1964
##
                           =>
                              {}
##
   [20]
         {,NA}
                           =>
                              {ADM2}
                                        0.68029096 0.6805267
                                                               0.9998374 1964
   [21]
##
         {ADM2}
                              {Q-ADM1} 0.53204018 0.7816794
                                                               1.1306154 1536
                           =>
   [22]
         {Q-ADM1}
                           =>
                              {ADM2}
                                        0.53204018 0.7695391
                                                               1.1306154 1536
  [23]
##
         {ADM2,Q-ADM1}
                           =>
                              {}
                                        0.53204018 1.0000000
                                                               1.0003465 1536
##
   [24]
         {,ADM2}
                              {Q-ADM1} 0.53204018 0.7820774
                                                               1.1311911 1536
                           =>
   [25]
##
         {,Q-ADM1}
                              {ADM2}
                                        0.53204018 0.7695391
                                                               1.1306154 1536
   [26]
         {ADM2,Q-ADM1}
                           =>
                              {NA}
                                        0.53204018 1.0000000
                                                               1.0000000 1536
   [27]
##
         {ADM2,NA}
                           =>
                              {Q-ADM1} 0.53204018 0.7816794
                                                               1.1306154 1536
##
   [28]
         {NA,Q-ADM1}
                              {ADM2}
                                        0.53204018 0.7695391
                                                               1.1306154 1536
                           =>
   [29]
                                                               1.0003465 1276
##
         {PCLI}
                           =>
                              {}
                                        0.44198130 1.0000000
   [30]
         {PCLI}
                              {NA}
                                        0.44198130 1.0000000
                                                               1.0000000 1276
##
                           =>
##
   [31]
         {,PCLI}
                           =>
                              {NA}
                                        0.44198130 1.0000000
                                                               1.0000000 1276
   [32]
##
         {NA,PCLI}
                           => {}
                                        0.44198130 1.0000000
                                                               1.0003465 1276
   [33]
         {PCLI}
                              {ADM2}
                                        0.35088327 0.7938871
                                                               1.1663879 1013
##
   [34]
                              {PCLI}
         {ADM2}
                                        0.35088327 0.5155216
                                                               1.1663879 1013
                           =>
##
   [35]
         {ADM2,PCLI}
                           =>
                              {}
                                        0.35088327 1.0000000
                                                               1.0003465 1013
                                        0.35088327 0.7938871
##
   [36]
         {,PCLI}
                           =>
                              {ADM2}
                                                               1.1663879 1013
   [37]
         {,ADM2}
                             {PCLI}
##
                                        0.35088327 0.5157841
                                                               1.1669818 1013
   [38]
         {ADM2,PCLI}
##
                              {NA}
                                        0.35088327 1.0000000
                                                               1.0000000 1013
                           =>
   [39]
         {NA, PCLI}
                              {ADM2}
##
                           =>
                                        0.35088327 0.7938871
                                                               1.1663879 1013
##
   [40]
         {ADM2,NA}
                           => {PCLI}
                                        0.35088327 0.5155216
                                                               1.1663879 1013
   [41]
         {PCLI}
                           => {Q-ADM1} 0.34187738 0.7735110
                                                               1.1188007
                                                                           987
   [42]
##
         {PCLI,Q-ADM1}
                           => {}
                                        0.34187738 1.0000000
                                                               1.0003465
                                                                           987
##
   [43]
         {,PCLI}
                           => {Q-ADM1} 0.34187738 0.7735110
                                                               1.1188007
                                                                           987
   [44]
                           => {NA}
                                                               1.0000000
##
         {PCLI,Q-ADM1}
                                        0.34187738 1.0000000
                                                                           987
   [45]
         {NA,PCLI}
                              {Q-ADM1} 0.34187738 0.7735110
                                                               1.1188007
##
                           =>
                                                                           987
##
   [46]
         {Q-PPL}
                           =>
                              {NA}
                                        0.28229997 1.0000000
                                                               1.0000000
                                                                           815
##
   [47]
         {Q-PPL}
                           =>
                              {}
                                        0.28195359 0.9987730
                                                               0.9991191
                                                                           814
   [48]
         {,Q-PPL}
                              {NA}
                                        0.28195359 1.0000000
                                                               1.0000000
                                                                           814
   [49]
         {NA,Q-PPL}
                           => {}
                                        0.28195359 0.9987730
                                                               0.9991191
##
                                                                           814
   [50]
         {ADM2,PCLI}
                           => {Q-ADM1} 0.27918254 0.7956565
                                                                           806
##
                                                               1.1508318
##
   [51]
         {PCLI,Q-ADM1}
                           => {ADM2}
                                        0.27918254 0.8166160
                                                               1.1997814
                                                                           806
   [52]
         {ADM2,Q-ADM1}
                           =>
                              {PCLI}
                                        0.27918254 0.5247396
                                                               1.1872439
                                                                            806
   [53]
         {Q-ADM2}
                                        0.25978524 1.0000000
                                                               1.0003465
##
                           =>
                              {}
                                                                           750
   [54]
         {Q-ADM2}
                                        0.25978524 1.0000000
                                                               1.0000000
##
                           =>
                              {NA}
                                                                           750
   [55]
##
         {,Q-ADM2}
                              {NA}
                                        0.25978524 1.0000000
                                                               1.0000000
                                                                           750
                           =>
   [56]
         \{NA,Q-ADM2\}
                           =>
                              {}
                                        0.25978524 1.0000000
                                                               1.0003465
                                                                           750
   [57]
         {Q-PPL}
                                        0.22168341 0.7852761
##
                           =>
                              {ADM2}
                                                               1.1537364
                                                                           640
##
   [58]
         {ADM2,Q-PPL}
                           =>
                              {NA}
                                        0.22168341 1.0000000
                                                               1.0000000
                                                                           640
         {NA,Q-PPL}
##
   [59]
                              {ADM2}
                           =>
                                        0.22168341 0.7852761
                                                               1.1537364
                                                                           640
##
   [60]
         {ADM2,Q-PPL}
                           => {}
                                        0.22133703 0.9984375
                                                               0.9987835
                                                                           639
   [61]
##
         {,Q-PPL}
                           =>
                              {ADM2}
                                        0.22133703 0.7850123
                                                               1.1533488
                                                                           639
##
   [62]
         {Q-PPL}
                           =>
                              {Q-ADM1} 0.21059924 0.7460123
                                                               1.0790268
                                                                           608
                              {}
##
   [63]
         {Q-ADM1,Q-PPL}
                           =>
                                        0.21059924 1.0000000
                                                               1.0003465
                                                                            608
##
   [64]
         {,Q-PPL}
                           =>
                              {Q-ADM1} 0.21059924 0.7469287
                                                               1.0803524
                                                                           608
##
   [65]
         {Q-ADM1,Q-PPL}
                              {NA}
                                        0.21059924 1.0000000
                                                               1.0000000
                                                                            608
   [66]
##
         {NA,Q-PPL}
                              {Q-ADM1} 0.21059924 0.7460123
                                                               1.0790268
                                                                           608
##
   [67]
         {ADM2,Q-PPL}
                           => {Q-ADM1} 0.17907863 0.8078125
                                                               1.1684142
                                                                           517
##
  [68]
         {Q-ADM1,Q-PPL}
                           => {ADM2}
                                        0.17907863 0.8503289
                                                               1.2493128
                                                                           517
## [69]
         {Q-ADM2}
                           => {ADM2}
                                        0.17284378 0.6653333 0.9775152
                                                                           499
```

```
## [71]
                                                                        499
         {,Q-ADM2}
                         => {ADM2}
                                      0.17284378 0.6653333 0.9775152
## [72]
         {ADM2,Q-ADM2}
                         => {NA}
                                      0.17284378 1.0000000
                                                            1.0000000
                                                                        499
                         => {ADM2}
## [73]
                                      0.17284378 0.6653333
                                                            0.9775152
                                                                        499
         {NA,Q-ADM2}
## [74]
         {PCLI,Q-PPL}
                         => {}
                                      0.13647385 1.0000000
                                                            1.0003465
## [75]
        {PCLI,Q-PPL}
                         => {NA}
                                                           1.0000000
                                      0.13647385 1.0000000
## [76]
                         => {}
                                      0.13543471 1.0000000
        {0-}
                                                            1.0003465
## [77]
         {Q-}
                         => {NA}
                                      0.13543471 1.0000000
                                                            1.0000000
                                                                        391
## [78]
        {,Q-}
                         => {NA}
                                      0.13543471 1.0000000
                                                            1.0000000
                                                                        391
## [79]
                         => {}
        \{NA,Q-\}
                                      0.13543471 1.0000000
                                                            1.0003465
## [80]
         {PCLI,Q-ADM2}
                         => {}
                                      0.12885348 1.0000000
                                                            1.0003465
## [81]
                         => {NA}
                                      0.12885348 1.0000000
         {PCLI,Q-ADM2}
                                                            1.0000000
                                                                        372
## [82]
         {PCLI,Q-PPL}
                         => {ADM2}
                                      0.12123311 0.8883249
                                                            1.3051368
                                                                        350
## [83]
         {ADM2,Q-PPL}
                         => {PCLI}
                                      0.12123311 0.5468750
                                                           1.2373261
                                                                        350
## [84]
         {Q-ADM1,Q-ADM2} \Rightarrow {}
                                      0.11707655 1.0000000
                                                           1.0003465
                                                                        338
## [85]
         {Q-ADM1,Q-ADM2} \Rightarrow {NA}
                                      0.11707655 1.0000000
                                                            1.0000000
                                                                        338
## [86]
                         => {Q-ADM1} 0.11291999 0.8274112
         {PCLI,Q-PPL}
                                                            1.1967615
                                                                        326
## [87]
         {Q-ADM1,Q-PPL}
                         => {PCLI}
                                      0.11291999 0.5361842
                                                            1.2131378
                                                                        326
## [88]
                         => {ADM2}
         {Q-}
                                      0.10633876 0.7851662
                                                           1.1535750
                                                                        307
                         => {}
## [89]
         \{ADM2,Q-\}
                                      0.10633876 1.0000000
                                                            1.0003465
## [90]
        {,Q-}
                         => {ADM2}
                                      0.10633876 0.7851662 1.1535750
                                                                        307
## [91]
         \{ADM2,Q-\}
                         => {NA}
                                      0.10633876 1.0000000 1.0000000
## [92]
         {NA,Q-}
                         => {ADM2}
                                      0.10633876 0.7851662
                                                           1.1535750
                                                                        307
## [93]
         {Q-}
                         => {Q-ADM1} 0.09144441 0.6751918
                                                            0.9765926
                                                                        264
## [94]
         {Q-,Q-ADM1}
                         => {}
                                      0.09144441 1.0000000 1.0003465
                                                                        264
## [95]
         {,Q-}
                         => {Q-ADM1} 0.09144441 0.6751918 0.9765926
## [96]
         {Q-,Q-ADM1}
                         => {NA}
                                      0.09144441 1.0000000
                                                                        264
                                                            1.0000000
## [97]
                         => {Q-ADM1} 0.09144441 0.6751918
         \{NA,Q-\}
                                                           0.9765926
                                                                        264
## [98]
         {PCLI,Q-ADM2}
                         => {ADM2}
                                      0.09075165 0.7043011
                                                           1.0347670
                                                                        262
## [99]
         {ADM2,Q-ADM2}
                         => {PCLI}
                                      0.09075165 0.5250501 1.1879464
                                                                        262
## [100] {Q-ADM1,Q-ADM2} => {ADM2}
                                      0.08001386 0.6834320 1.0041059
                                                                        231
t_p = ggplot(type_rules@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "top", legend.box = "horizontal") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
ts_p = ggplot(type_rules_swq@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
td_p = ggplot(type_rules_dwq@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
s_p = ggplot(scale_rules@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord cartesian(xlim =c(0.0, 1.0), ylim = c(0.5, 1.0))
ss_p = ggplot(scale_rules_swq@quality, aes(x=support, y=confidence)) +
```

0.17284378 1.0000000 1.0003465

[70]

{ADM2,Q-ADM2}

=> {}

```
geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
sd_p = ggplot(scale_rules_dwq@quality, aes(x=support, y=confidence)) +
  geom point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme bw() +theme(legend.position = "none") +
  coord cartesian(xlim =c(0.0, 1.0), ylim = c(0.5, 1.0))
p_p = ggplot(imp_rules@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
ps_p = ggplot(prom_rules_swq@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord_cartesian(xlim = c(0.0, 1.0), ylim = c(0.5, 1.0))
pd_p = ggplot(prom_rules_dwq@quality, aes(x=support, y=confidence)) +
  geom_point(aes(colour= lift)) +
  scale_color_gradient(low = "#ffffff", high = "#000000", limits=c(0.6, 2.2)) +
  theme_bw() + theme(legend.position = "none") +
  coord cartesian(xlim =c(0.0, 1.0), ylim = c(0.5, 1.0))
grid.arrange(t_p, ts_p, td_p, s_p, ss_p, sd_p, p_p, ps_p, pd_p, ncol=3, nrow = 3, layout_matrix = rbind
```

