IST 707 Applied Machine Learning HW3: Association Rules

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```
library(arules)
## Loading required package: Matrix
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
       abbreviate, write
library(arulesViz)
## Warning: replacing previous import 'lifecycle::last_warnings' by
## 'rlang::last_warnings' when loading 'tibble'
## Warning: replacing previous import 'lifecycle::last_warnings' by
## 'rlang::last_warnings' when loading 'pillar'
# read data from csv file
bankData <- read.csv("/Users/shivangi/Downloads/bank-data(1).csv")</pre>
str(bankData)
## 'data.frame': 600 obs. of 12 variables:
## $ id : chr "ID12101" "ID12102" "ID12103" "ID12104" ...
## $ age : int 48 40 51 23 57 57 22 58 37 54 ...
## $ sex : chr "FEMALE" "MALE" "FEMALE" ...
## $ region : chr "INNER_CITY" "TOWN" "INNER_CITY" "TOWN" ... ## $ income : num 17546 30085 16575 20375 50576 ...
## $ married : chr "NO" "YES" "YES" "YES" ...
## $ children : int 1 3 0 3 0 2 0 0 2 2 ...
## $ car : chr "NO" "YES" "YES" "NO" ...
## $ save_act : chr "NO" "NO" "YES" "NO" ...
## $ current_act: chr "NO" "YES" "YES" "YES" ...
## $ mortgage : chr "NO" "YES" "NO" "NO" ...
## $ pep : chr "YES" "NO" "NO" "NO" ...
```

```
bankData <- subset(bankData, select = -id)</pre>
str(bankData)
                  600 obs. of 11 variables:
## 'data.frame':
## $ age
                : int 48 40 51 23 57 57 22 58 37 54 ...
               : chr "FEMALE" "MALE" "FEMALE" "FEMALE" ...
## $ sex
              : chr "INNER_CITY" "TOWN" "INNER_CITY" "TOWN" ...
## $ region
               : num 17546 30085 16575 20375 50576 ...
## $ income
## $ married
                : chr "NO" "YES" "YES" "YES" ...
## $ children : int 1 3 0 3 0 2 0 0 2 2 ...
## $ car : chr "NO" "YES" "YES" "NO" ...
## $ save_act : chr "NO" "NO" "YES" "NO" ...
                       "NO" "YES" "YES" "YES" ...
## $ current_act: chr
## $ mortgage : chr "NO" "YES" "NO" "NO" ...
                : chr "YES" "NO" "NO" "NO" ...
## $ pep
bankData$age = discretize(bankData$age)
bankData$income = discretize(bankData$income)
# bankData$married = dplyr::recode(bankData$married, YES = "married=YES", NO = "married=NO")
# bankData$car = dplyr::recode(bankData$car, YES = "car=YES", NO = "car=NO")
# bankData$save_act = dplyr::recode(bankData$save_act, YES = "save_act=YES", NO = "save_act=NO")
# bankData$current_act = dplyr::recode(bankData$current_act, YES = "current_act=YES", NO = "current_act
# bankData$mortgage = dplyr::recode(bankData$mortgage, YES = "mortgage=YES", NO = "mortgage=NO")
# bankData$pep = dplyr::recode(bankData$pep, YES = "pep=YES", NO = "pep=NO")
bankData$children = factor(bankData$children)
bankData$sex = factor(bankData$sex)
bankData$region = factor(bankData$region)
bankData$car = factor(bankData$car)
bankData$save_act = factor(bankData$save_act)
bankData$current_act = factor(bankData$current_act)
bankData$mortgage = factor(bankData$mortgage)
bankData$pep = factor(bankData$pep)
bankData$married = factor(bankData$married)
myRules = apriori(bankData, parameter = list(supp = 0.001, conf = 0.9, minlen = 3))
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval original Support maxtime support minlen
##
          0.9
                 0.1
                        1 none FALSE
                                                TRUE
                                                               0.001
## maxlen target ext
##
       10 rules TRUE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
##
      0.1 TRUE TRUE FALSE TRUE
                                        TRUE
## Absolute minimum support count: 0
##
```

```
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[28 item(s), 600 transaction(s)] done [0.00s].
## sorting and recoding items ... [28 item(s)] done [0.00s].
## creating transaction tree ... done [0.00s].
## checking subsets of size 1 2 3 4 5 6 7 8 9 10
## Warning in apriori(bankData, parameter = list(supp = 0.001, conf = 0.9, : Mining
## stopped (maxlen reached). Only patterns up to a length of 10 returned!
## done [0.09s].
## writing ... [681745 rule(s)] done [0.13s].
## creating S4 object ... done [0.33s].
# rules = apriori(qroceries, parameter = list(supp = 0.001, conf = 0.8))
options(digits = 2)
# myRules <- sort(myRules, by = "confidence", decreasing = TRUE)</pre>
# inspect(myRules)
# rules <- apriori(data = bankData, parameter = list(supp = 0.001, conf = 0.09, maxlen = 3), appearance
# rules <- apriori(bankData, parameter = list(supp = 0.001, conf = 0.9, maxlen = 4))</pre>
pepRules <- apriori(data = bankData, parameter = list(supp = 0.08, conf = 0.6, minlen = 3), control = 1</pre>
pepRulesSorted <- sort(pepRules, by = "lift", descending = TRUE)</pre>
inspect(pepRulesSorted)
##
                                                    support confidence coverage lift count
        lhs
                                         rhs
## [1]
        {married=YES,
##
         children=1,
         save act=YES}
                                      => {pep=YES}
                                                      0.095
                                                                  0.88
                                                                           0.108 1.9
                                                                                         57
        {children=1,
##
  [2]
##
         save_act=YES,
##
         mortgage=NO}
                                      => {pep=YES}
                                                      0.080
                                                                  0.87
                                                                           0.092 1.9
                                                                                         48
## [3]
        {children=1,
##
         save_act=YES,
                                      => {pep=YES}
                                                                  0.86
                                                                           0.122 1.9
##
         current_act=YES}
                                                      0.105
                                                                                         63
## [4]
        {married=YES,
##
         children=1,
         current_act=YES}
                                      => {pep=YES}
                                                                  0.86
##
                                                      0.093
                                                                           0.108 1.9
                                                                                         56
## [5]
        {children=1,
                                      => {pep=YES}
##
         mortgage=NO}
                                                      0.118
                                                                  0.85
                                                                          0.140 1.9
                                                                                         71
## [6]
        {children=1,
                                      => {pep=YES}
##
         save act=YES}
                                                      0.133
                                                                  0.84
                                                                           0.158 1.8
                                                                                         80
## [7]
        {children=1,
##
         current_act=YES,
         mortgage=NO}
                                      => {pep=YES}
                                                      0.095
                                                                  0.84
                                                                          0.113 1.8
                                                                                         57
##
        {sex=FEMALE,
## [8]
         children=1}
                                      => {pep=YES}
##
                                                      0.092
                                                                  0.83
                                                                          0.110 1.8
                                                                                         55
## [9]
        {children=1,
         current_act=YES}
                                      => {pep=YES}
                                                                  0.83
                                                                           0.168 1.8
##
                                                      0.140
                                                                                         84
## [10] {married=YES,
```

##		children=1}	=>	{pep=YES}	0.123	0.83	0.148	1.8	74
##	[11]	{children=1,		(beb-1Fp)	0.125	0.00	0.140	1.0	17
##		car=YES}	=>	{pep=YES}	0.092	0.82	0.112	1.8	55
##	[12]	{children=1,		-1 1					
##		car=NO}	=>	{pep=YES}	0.092	0.81	0.113	1.8	55
##	[13]	{sex=MALE,							
##		children=1}	=>	{pep=YES}	0.092	0.80	0.115	1.7	55
##	[14]	<pre>{region=INNER_CITY,</pre>							
##		children=1}	=>	{pep=YES}	0.085	0.78	0.108	1.7	51
##	[15]	$\{income = [3.11e+04,6.31e+04],$							
##	.	married=NO}	=>	{pep=YES}	0.093	0.78	0.120	1.7	56
##	[16]	{married=NO,							
##		save_act=YES,							
##		current_act=YES,		(Mad	0.000	0.70	0 447	4 7	
##	[47]	mortgage=NO}	=>	{pep=YES}	0.088	0.76	0.117	1.7	53
## ##	[T/]	<pre>{married=NO, save_act=YES,</pre>							
##		mortgage=NO}	=>	{pep=YES}	0.107	0.74	0.143	1.6	64
##	[18]	{married=NO,		(bcb irp)	0.107	0.74	0.140	1.0	0-1
##		current_act=YES,							
##		mortgage=NO}	=>	{pep=YES}	0.122	0.72	0.170	1.6	73
##	[19]	{age=[49,67],							
##		married=NO}	=>	{pep=YES}	0.087	0.71	0.122	1.6	52
##	[20]	{married=NO,							
##		mortgage=NO}	=>	{pep=YES}	0.153	0.71	0.217	1.5	92
##	[21]	{married=NO,							
##		children=0}	=>	{pep=YES}	0.095	0.69	0.138	1.5	57
##	[22]	{age=[49,67],							
##		income=[3.11e+04,6.31e+04],							
##		<pre>save_act=YES,</pre>							
		mart care-MOl	-\	Jnan-VECl	0 000	0 60	0 125	1 5	55
	เวรา	mortgage=NO}	=>	{pep=YES}	0.092	0.68	0.135	1.5	55
##	[23]	$\{income=[3.11e+04,6.31e+04],$	=>	{pep=YES}	0.092	0.68	0.135	1.5	55
## ##	[23]	<pre>{income=[3.11e+04,6.31e+04], car=YES,</pre>							
##		<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO}</pre>		{pep=YES} {pep=YES}	0.092	0.68	0.135	1.5	55 50
## ## ##		<pre>{income=[3.11e+04,6.31e+04], car=YES,</pre>							
## ## ## ##		<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04],</pre>	=>						
## ## ## ##	[24]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES,</pre>	=>	{pep=YES}	0.083	0.68	0.123	1.5	50
## ## ## ## ##	[24]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO}</pre>	=>	{pep=YES}	0.083	0.68	0.123	1.5	50
## ## ## ## ## ##	[24]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES,</pre>	=>	{pep=YES} {pep=YES}	0.083	0.68	0.123	1.5	50
## ## ## ## ## ## ##	[24] [25]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO}</pre>	=>	{pep=YES}	0.083	0.68	0.123	1.5	50
## ## ## ## ## ## ##	[24] [25]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67],</pre>	=>	{pep=YES} {pep=YES}	0.083	0.68	0.123	1.5	50 76
## ## ## ## ## ## ##	[24] [25]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04],</pre>	=>	{pep=YES} {pep=YES}	0.083	0.68	0.123	1.5	50 76
## ## ## ## ## ## ## ##	[24] [25]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES,</pre>	=> =>	{pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102	0.68 0.67 0.66	0.123 0.188 0.153	1.5 1.5	50 76 61
## ## ## ## ## ## ## ##	[24] [25] [26]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO}</pre>	=> =>	{pep=YES} {pep=YES}	0.083	0.68	0.123	1.5 1.5	50 76
## ## ## ## ## ## ## ## ##	[24] [25] [26]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], incomegage=NO} {age=[49,67],</pre>	=> =>	{pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102	0.68 0.67 0.66	0.123 0.188 0.153	1.5 1.5	50 76 61
## ## ## ## ## ## ## ## ##	[24] [25] [26]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], income=[3.11e+04,6.31e+04], income=[3.11e+04,6.31e+04], }</pre>	=> => =>	{pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102	0.68 0.67 0.66	0.123 0.188 0.153	1.5 1.5 1.5	50 76 61
## ## ## ## ## ## ## ## ##	[24] [25] [26]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], income=[3.11e+04,6.31e+04], mortgage=NO}</pre>	=> => =>	{pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102	0.68 0.67 0.66	0.123 0.188 0.153	1.5 1.5	50 76 61
## ## ## ## ## ## ## ## ##	[24] [25] [26]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04],</pre>	=> => =>	{pep=YES} {pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102 0.085 0.105	0.68 0.67 0.66	0.123 0.188 0.153 0.128 0.160	1.5 1.5 1.5	50 76 61
## ## ## ## ## ## ## ## ## ##	[24] [25] [26] [27] [28]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], income=[3.11e+04,6.31e+04], mortgage=NO}</pre>	=> => =>	{pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102	0.68 0.67 0.66 0.66	0.123 0.188 0.153 0.128 0.160	1.5 1.5 1.5	50 76 61 51
## ## ## ## ## ## ## ## ## ##	[24] [25] [26] [27] [28]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04], mortgage=NO}</pre>	=> => =>	{pep=YES} {pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102 0.085 0.105	0.68 0.67 0.66 0.66	0.123 0.188 0.153 0.128 0.160	1.5 1.5 1.5	50 76 61 51
## ## ## ## ## ## ## ## ## ## ## ## ##	[24] [25] [26] [27] [28] [29]	<pre>{income=[3.11e+04,6.31e+04], car=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, mortgage=NO} {income=[3.11e+04,6.31e+04], save_act=YES, current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], current_act=YES, mortgage=NO} {age=[49,67], income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04], mortgage=NO} {income=[3.11e+04,6.31e+04],</pre>	=> => => =>	{pep=YES} {pep=YES} {pep=YES} {pep=YES}	0.083 0.127 0.102 0.085 0.105	0.68 0.67 0.66 0.66	0.123 0.188 0.153 0.128 0.160	1.5 1.5 1.5	50 76 61 51

## mortgage=N0}	## ## ##	[31]	<pre>married=NO} {age=[49,67], save_act=YES, current_act=YES,</pre>	=>	{pep=YES}	0.095	0.63	0.152	1.4	57
<pre>## income=[3.11e+04,6.31e+04], ## car=YES}</pre>	##	โรวไ	mortgage=NO}	=>	{pep=YES}	0.085	0.62	0.137	1.4	51
<pre>## [33] {age=[49,67], ## income=[3.11e+04,6.31e+04], ## save_act=YES} => {pep=YES} 0.125</pre>	##	[02]	income=[3.11e+04,6.31e+04],		(,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,					4.0
<pre>## save_act=YES}</pre>		[33]		=>	{pep=YES}	0.080	0.62	0.130	1.3	48
<pre>## [34] {income=[3.11e+04,6.31e+04], ## car=YES, ## save_act=YES} => {pep=YES} 0.095 0.61 0.155 1.3 57 ## [35] {sex=MALE, ## income=[3.11e+04,6.31e+04]} => {pep=YES} 0.105 0.61 0.172 1.3 63 ## [36] {married=NO, ## car=NO, ## current_act=YES} => {pep=YES} 0.085 0.61 0.140 1.3 51 ## [37] {sex=MALE, ## income=[3.11e+04,6.31e+04], ## save_act=YES} => {pep=YES} 0.090 0.61 0.148 1.3 54 ## [38] {age=[49,67], ## income=[3.11e+04,6.31e+04], ## save_act=YES} => {pep=YES} 0.095 0.61 0.157 1.3 57 ## [39] {age=[49,67], ## income=[3.11e+04,6.31e+04]} => {pep=YES} 0.140 0.60 0.233 1.3 84 ## [40] {age=[49,67], ## current_act=YES,</pre>				=>	{nen=YES}	0.125	0.61	0.203	1.3	75
<pre>## save_act=YES} => {pep=YES} 0.095 0.61 0.155 1.3 57 ## [35] {sex=MALE,</pre>	##	[34]	$\{income = [3.11e+04,6.31e+04],$		cpop 120)	0.120	0.02	0.200	2.0	
<pre>## income=[3.11e+04,6.31e+04]} => {pep=YES}</pre>			•	=>	{pep=YES}	0.095	0.61	0.155	1.3	57
<pre>## [36] {married=N0,</pre>		[35]	•	=>	{pep=YES}	0.105	0.61	0.172	1.3	63
<pre>## current_act=YES}</pre>		[36]	{married=NO,							
<pre>## income=[3.11e+04,6.31e+04], ## save_act=YES} => {pep=YES} 0.090</pre>	##	53	current_act=YES}	=>	{pep=YES}	0.085	0.61	0.140	1.3	51
<pre>## [38] {age=[49,67], ## income=[3.11e+04,6.31e+04], ## save_act=YES, ## current_act=YES}</pre>		[37]	-							
<pre>## income=[3.11e+04,6.31e+04], ## save_act=YES, ## current_act=YES} => {pep=YES} 0.095 0.61 0.157 1.3 57 ## [39] {age=[49,67], ## income=[3.11e+04,6.31e+04]} => {pep=YES} 0.140 0.60 0.233 1.3 84 ## [40] {age=[49,67], ## current_act=YES,</pre>		[38]	-	=>	{pep=YES}	0.090	0.61	0.148	1.3	54
<pre>## current_act=YES} => {pep=YES} 0.095 0.61 0.157 1.3 57 ## [39] {age=[49,67], ## income=[3.11e+04,6.31e+04]} => {pep=YES} 0.140 0.60 0.233 1.3 84 ## [40] {age=[49,67], ## current_act=YES,</pre>	##	[00]	income=[3.11e+04,6.31e+04],							
<pre>## income=[3.11e+04,6.31e+04]} => {pep=YES} 0.140 0.60 0.233 1.3 84 ## [40] {age=[49,67],</pre>	##		current_act=YES}	=>	{pep=YES}	0.095	0.61	0.157	1.3	57
<pre>## [40] {age=[49,67], ## current_act=YES,</pre>		[39]		=>	{pep=YES}	0.140	0.60	0.233	1.3	84
		[40]	{age=[49,67],		- -					
			_	=>	{pep=YES}	0.110	0.60	0.183	1.3	66