R for Marketing - Market Basket Analysis

This R code book written by Rohit Dhankar . GitHub - https://github.com/RohitDhankar

 ${\it Code and Data} > {\it Rohit Dhankar-GITHUB}$

The dataset is Copyrighted by -

Brijs T., Swinnen G., Vanhoof K., and Wets G. (1999), The use of association rules for prod- uct assortment decisions: a case study, in: Proceedings of the Fifth International Conference on Knowledge Discovery and Data Mining, San Diego (USA), August 15-18, pp. 254-260. ISBN: 1-58113-143-7.

R for Marketing - Market Basket Analysis

```
# Getting the Retail Sales Data -- http://fimi.ua.ac.be/data/retail.pdf
# Data can also be taken from -- http://r-marketing.r-forge.r-project.org
# Also at -- http://www.cis.hut.fi/Opinnot/T-61.5060/2005/t615060-l-2005-09-29-b.pdf
# Set Seed -- ensure reproducible results
set.seed(123)
require(arules) # Mining Association Rules and Frequent Itemsets
## Loading required package: arules
## Loading required package: Matrix
## Attaching package: 'arules'
## The following objects are masked from 'package:base':
##
##
       abbreviate, write
#fileURL <- "http://fimi.ua.ac.be/data/retail.dat.qz"
#download.file(fileURL, destfile="retail.data.qz", method="curl")
# Read the data in basket format
transaction_data = read.transactions("retail.data.gz", format = "basket", sep=" ");
# The Structure of the Data
str(transaction data)
## Formal class 'transactions' [package "arules"] with 3 slots
##
     ..@ data
                   :Formal class 'ngCMatrix' [package "Matrix"] with 5 slots
##
     .. .. ..@ i
                       : int [1:908576] 0 1 2 1113 2224 3335 4446 5557 6668 7249 ...
##
     .. .. ..@ р
                       : int [1:88163] 0 30 33 36 47 51 64 70 73 79 ...
                       : int [1:2] 16470 88162
##
     .. .. ..@ Dim
##
     .. .. ..@ Dimnames:List of 2
     .. .. .. ..$ : NULL
##
     .. .. .. $ : NULL
##
     .. .. ..@ factors : list()
     ..@ itemInfo :'data.frame': 16470 obs. of 1 variable:
##
```

```
....$ labels: chr [1:16470] "0" "1" "10" "100" ...
##
##
     ..@ itemsetInfo:'data.frame': 0 obs. of 0 variables
##
# Highlighted for focus ---
# .. .. @ i
# : int [1:908576] 0 1 2 1113 2224 3335 4446 5557 6668 7249 ...
# ##
# : int [1:88163] 0 30 33 36 47 51 64 70 73 79 ...
# .. .. @ Dim
# : int [1:2] 16470 88162
# The Summary of the Data
summary(transaction_data)
## transactions as itemMatrix in sparse format with
    88162 rows (elements/itemsets/transactions) and
    16470 columns (items) and a density of 0.0006257289
##
##
## most frequent items:
##
        39
                 48
                          38
                                  32
                                           41 (Other)
##
     50675
             42135
                      15596
                               15167
                                        14945 770058
##
## element (itemset/transaction) length distribution:
## sizes
           2
                 3
                      4
                            5
                                 6
                                      7
                                            8
                                                 9
                                                      10
                                                                           14
                                                                                 15
##
      1
                                                           11
                                                                12
                                                                      13
## 3016 5516 6919 7210 6814 6163 5746 5143 4660 4086
                                                         3751 3285 2866 2620 2310
                           20
                                21
                                     22
                                                           26
                                                                27
                                                                      28
                                                                           29
##
     16
          17
                18
                     19
                                           23
                                                24
                                                      25
                                                                                 30
## 2115 1874 1645 1469 1290 1205
                                    981
                                          887
                                               819
                                                     684
                                                          586
                                                               582
                                                                     472
                                                                          480
                                                                                355
                                                                      43
##
     31
          32
                33
                     34
                           35
                                36
                                     37
                                           38
                                                39
                                                      40
                                                           41
                                                                42
                                                                           44
                                                                                 45
         303
                                    153
                                                                      71
##
    310
               272
                    234
                          194
                               136
                                          123
                                               115
                                                     112
                                                           76
                                                                 66
                                                                           60
                                                                                 50
##
                                                                                 60
     46
          47
                48
                     49
                          50
                                51
                                     52
                                           53
                                                54
                                                      55
                                                           56
                                                                57
                                                                      58
                                                                           59
##
     44
          37
                37
                     33
                           22
                                24
                                     21
                                           21
                                                10
                                                      11
                                                           10
                                                                 9
##
     61
          62
                63
                     64
                           65
                                66
                                     67
                                           68
                                                71
                                                      73
                                                           74
                                                                76
##
                 5
                      2
                            2
                                 5
                                      3
                                            3
                                                 1
                                                      1
                                                            1
                                                                 1
##
##
      Min. 1st Qu.
                     Median
                                Mean 3rd Qu.
                                                 Max.
##
      1.00
               4.00
                       8.00
                               10.31
                                        14.00
                                                76.00
##
## includes extended item information - examples:
##
     labels
## 1
          0
## 2
          1
## 3
         10
```

Data Summary

- 1. Each ROW or Obs of the data is 1 Market Basket.
- 2. Each Market Basket has many different purchase items.

- 3. There are 88,162 ROWS.
- 4. Each ROW mostly has different no. of purchase items.

```
# Using Function - readLines() from BASE
transaction_data1<- readLines("~/Desktop/R_Own/R_Marketing/Mkt_DATA_Files/retail.dat")
# Read the HEAD end of the Data
head(transaction_data1)
## [1] "0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 "
## [2] "30 31 32 "
## [3] "33 34 35 "
## [4] "36 37 38 39 40 41 42 43 44 45 46 "
## [5] "38 39 47 48 "
## [6] "38 39 48 49 50 51 52 53 54 55 56 57 58 "
# Read Only the 5th MARKET BASKET and see how many ITEMS in it and WHICH ALL Items ?
head(transaction_data1[5])
## [1] "38 39 47 48 "
# Read TAIL end of the Data
tail(transaction_data1)
## [1] "48 201 255 278 407 479 767 824 986 1395 1598 2022 2283 2375 6725 13334 14006 14099 "
## [2] "39 875 2665 2962 12959 14070 14406 15518 16379 "
## [3] "39 41 101 346 393 413 479 522 586 635 695 799 1466 1786 1994 2449 2830 3035 3591 3722 6217 1149
## [4] "2310 4267 "
## [5] "39 48 2528 "
## [6] "32 39 205 242 1393 "
We can now create a DATA STRUCTURE with LABELS for each,
Market basket. Each Market Basket is also called a - TRANSACTION.
To create LABELS or ROW Names we need a NAMES Vector.
Lets create a ROW Labels Vector.
# Code for ROW Labels vector
ROW_Labels <- paste("Market_basket_",1:length(transaction_data1),sep="")
typeof(ROW_Labels)
## [1] "character"
#
class(ROW_Labels)
## [1] "character"
ROW_Labels[1:20] # Prints initial 20 LABELS
```

```
## [1] "Market_basket_1" "Market_basket_2" "Market_basket_3"
## [4] "Market_basket_4" "Market_basket_5" "Market_basket_6"
## [7] "Market_basket_7" "Market_basket_8" "Market_basket_9"
## [10] "Market_basket_10" "Market_basket_11" "Market_basket_12"
## [13] "Market_basket_13" "Market_basket_14" "Market_basket_15"
## [16] "Market_basket_16" "Market_basket_17" "Market_basket_18"
## [19] "Market_basket_19" "Market_basket_20"
## tail(ROW_Labels) # Market_basket_88162"
## [1] "Market_basket_88157" "Market_basket_88158" "Market_basket_88159"
## [4] "Market_basket_88160" "Market_basket_88161" "Market_basket_88162"
## str(ROW_Labels)
## chr [1:88162] "Market_basket_1" "Market_basket_2" ...
# As seen above - we have created a CHARACTER Vector with
# ROW_Lables == Market_basket_1 to Market_basket_88162
```

We now use the Function - strsplit(), to SPLIT the data at WHITESPACE into ROWS , thus whenever a WHITESPACE occurs or a MARKET BASKET or ROW ends the data is split into the Next Row .

```
transaction_list <-strsplit(transaction_data1,"")
#
str(transaction_list)</pre>
```

```
## List of 88162
   $ : chr [1:80] "0" " "1" " " ...
   $ : chr [1:9] "3" "0" " "3" ...
   $ : chr [1:9] "3" "3" " " "3" ...
## $ : chr [1:33] "3" "6" " " "3" ...
## $ : chr [1:12] "3" "8" " " "3" ...
## $ : chr [1:39] "3" "8" " "3" ...
## $ : chr [1:18] "3" "2" " "4" ...
## $ : chr [1:8] "3" " "3" "9" ...
## $ : chr [1:18] "6" "3" " "6" ...
## $ : chr [1:6] "3" "2" " "6" ...
## $ : chr [1:12] "4" "8" " "7" ...
## $ : chr [1:24] "3" "9" " "7" ...
## $ : chr [1:24] "3" "6" " " "3" ...
## $ : chr [1:9] "8" "2" " "8" ...
## $ : chr [1:15] "4" "1" " "8" ...
## $ : chr [1:47] "3" "9" " "4" ...
## $ : chr [1:15] "3" "6" " "3" ...
   $ : chr [1:34] "3" "9" " "4" ...
##
## $ : chr [1:17] "3" "8" " "3" ...
## $ : chr [1:35] "3" "9" " "1" ...
## $ : chr [1:60] "1" "1" "9" " " ...
   $ : chr [1:15] "4" "8" " "1" ...
##
## $ : chr [1:58] "3" "9" " "4" ...
## $ : chr [1:15] "3" "9" " " "1" ...
   $ : chr [1:21] "3" "8" " "3" ...
##
## $ : chr [1:23] "4" "8" " "1" ...
```

```
$ : chr [1:9] "3" "9" " "4" ...
   $ : chr [1:28] "1" "6" "1" " ...
   $ : chr [1:33] "3" "8" " "3" ...
   $ : chr [1:32] "3" "2" " "3" ...
   $ : chr [1:35] "3" "2" " "3" ...
##
   $ : chr [1:15] "3" "9" " "1" ...
   $ : chr [1:24] "3" "6" " " "3" ...
   $ : chr [1:58] "3" "9" " "4" ...
##
   $ : chr [1:39] "3" "9" " "2" ...
##
##
   $ : chr [1:34] "3" "9" " "6" ...
   $ : chr [1:40] "1" "7" "9" " " ...
   $ : chr [1:12] "2" "2" "5" " " ...
##
   $ : chr [1:25] "3" "9" " "4" ...
##
   $ : chr [1:53] "3" "6" " "3" ...
##
   $ : chr [1:15] "3" "9" " "2" ...
   $ : chr [1:29] "3" "9" " "4" ...
##
##
   $ : chr [1:21] "3" "9" " "4" ...
   $ : chr [1:11] "4" "8" " "2" ...
   $ : chr [1:44] "3" "9" " "4" ...
##
   $ : chr [1:10] "3" "9" " "4" ...
##
   $ : chr [1:33] "3" "6" " " "3" ...
##
   $ : chr [1:23] "3" "9" " "2" ...
   $ : chr [1:29] "3" "9" " "4" ...
##
   $ : chr [1:4] "2" "7" "4" " "
##
   $ : chr [1:48] "3" "2" " "3" ...
##
   $ : chr [1:9] "3" "9" " "4" ...
   $ : chr [1:35] "3" "8" " " "3" ...
##
   $ : chr [1:61] "3" "9" " "4" ...
   $ : chr [1:12] "3" "0" "0" " " ...
##
   $ : chr [1:89] "3" "6" " " "3" ...
   $ : chr [1:27] "1" "0" " "3" ...
##
##
   $ : chr [1:18] "3" "9" " "4" ...
   $ : chr [1:11] "3" "9" " " "3" ...
##
   $ : chr [1:39] "4" "8" " " "3" ...
##
   $ : chr [1:51] "1" "8" " "3" ...
##
   $ : chr [1:24] "3" "2" " "3" ...
##
   $ : chr [1:59] "4" "8" " "3" ...
##
   $ : chr [1:8] "3" "6" "5" " " ...
   $ : chr [1:51] "3" "8" " "3" ...
##
   $ : chr [1:60] "1" " "1" "1" ...
##
   $ : chr [1:16] "3" "8" "6" " " ...
   $ : chr [1:10] "3" "8" " "4" ...
##
   $ : chr [1:10] "3" "8" " "5" ...
   $ : chr [1:58] "3" "2" " "4" ...
##
   $ : chr [1:24] "3" "3" "8" " " ...
   $ : chr [1:15] "3" "9" " "4" ...
##
   $ : chr [1:86] "4" "8" " "8" ...
##
   $ : chr [1:29] "3" "9" " "4" ...
##
   $ : chr [1:28] "1" "4" "1" " ...
   $ : chr [1:15] "3" "9" " "4" ...
##
   $ : chr [1:25] "3" "9" " "4" ...
##
   $ : chr [1:87] "1" "5" " " "2" ...
   $ : chr [1:43] "4" "8" " "4" ...
##
   $ : chr [1:61] "3" "7" " "3" ...
##
```

```
$ : chr [1:22] "3" "9" " "4" ...
   $ : chr [1:10] "3" "9" " "4" ...
   $ : chr [1:12] "4" "7" "7" " ...
   $ : chr [1:35] "3" "9" " "1" ...
   $ : chr [1:24] "3" "2" " "3"
## $ : chr [1:21] "3" "8" " " "3" ...
  $ : chr [1:7] "6" "0" " " "3" ...
   $ : chr [1:65] "1" "1" " "3" ...
##
   $ : chr [1:3] "3" "9" " "
##
   $ : chr [1:11] "4" "1" " "1" ...
##
   $ : chr [1:28] "3" "2" " "3" ...
   $ : chr [1:10] "3" "8" " "4" ...
##
   $ : chr [1:56] "2" "2" "5" " "
## $ : chr [1:32] "3" "8" " "3" ...
## $ : chr [1:6] "3" "9" " "4" ...
   $ : chr [1:14] "3" "8" " "3" ...
##
## $ : chr [1:14] "2" " "5" "1" ...
  $ : chr [1:12] "3" "1" "0" " " ...
   $ : chr [1:11] "4" "1" " "5" ...
     [list output truncated]
#
# We Add the ROW names Labels
names(transaction_list) <- paste("Market_basket_",1:length(transaction_data1),sep="")</pre>
# Again see the STRUCTURE
str(transaction_list) #
## List of 88162
                        : chr [1:80] "0" " "1" " " ...
   $ Market_basket_1
                        : chr [1:9] "3" "0" " "3" ...
   $ Market_basket_2
                        : chr [1:9] "3" "3" " "3" ...
   $ Market_basket_3
                       : chr [1:33] "3" "6" " " "3" ...
   $ Market_basket_4
                       : chr [1:12] "3" "8" " " "3"
## $ Market_basket_5
                       : chr [1:39] "3" "8" " " "3" ...
## $ Market_basket_6
                       : chr [1:18] "3" "2" " "4" ...
##
   $ Market_basket_7
                        : chr [1:8] "3" " "3" "9" ...
##
   $ Market_basket_8
                       : chr [1:18] "6" "3" " "6" ...
## $ Market_basket_9
## $ Market_basket_10
                       : chr [1:6] "3" "2" " "6" ...
                       : chr [1:12] "4" "8" " "7" ...
## $ Market_basket_11
                       : chr [1:24] "3" "9" " "7" ...
## $ Market_basket_12
                       : chr [1:24] "3" "6" " " "3" ...
## $ Market_basket_13
                       : chr [1:9] "8" "2" " " "8" ...
## $ Market_basket_14
                       : chr [1:15] "4" "1" " "8" ...
##
   $ Market basket 15
                       : chr [1:47] "3" "9" " "4" ...
## $ Market_basket_16
                       : chr [1:15] "3" "6" " " "3" ...
## $ Market_basket_17
                       : chr [1:34] "3" "9" " "4" ...
## $ Market_basket_18
                       : chr [1:17] "3" "8" " " "3"
##
   $ Market_basket_19
                       : chr [1:35] "3" "9" " " "1"
## $ Market_basket_20
                       : chr [1:60] "1" "1" "9" " " ...
## $ Market_basket_21
                       : chr [1:15] "4" "8" " " "1" ...
   $ Market_basket_22
##
                       : chr [1:58] "3" "9" " "4" ...
##
   $ Market_basket_23
                       : chr [1:15] "3" "9" " " "1" ...
## $ Market_basket_24
```

```
: chr [1:21] "3" "8" " "3" ...
   $ Market_basket_25
                         : chr [1:23] "4" "8" " "1" ...
##
   $ Market_basket_26
                         : chr [1:9] "3" "9" " "4" ...
   $ Market basket 27
                         : chr [1:28] "1" "6" "1" "
##
   $ Market_basket_28
                         : chr [1:33] "3" "8" " "3"
##
   $ Market basket 29
                         : chr [1:32] "3" "2" " "3"
##
   $ Market basket 30
                                     "3" "2" " " "3" ...
   $ Market basket 31
                         : chr [1:35]
                         : chr [1:15] "3" "9" " "1"
##
    $ Market_basket_32
##
   $ Market_basket_33
                         : chr [1:24]
                                     "3" "6" " " "3"
                                     "3" "9" " " "4"
##
   $ Market_basket_34
                         : chr [1:58]
                         : chr [1:39] "3" "9" " "2"
   $ Market_basket_35
                         : chr [1:34] "3" "9" " "6"
##
    $ Market_basket_36
                         : chr [1:40]
                                     "1" "7" "9" " "
##
   $ Market_basket_37
                         : chr [1:12] "2" "2" "5" " "
   $ Market_basket_38
##
                         : chr [1:25] "3" "9" " "4" ...
    $ Market_basket_39
                         : chr [1:53] "3" "6" " "3"
##
    $ Market_basket_40
                         : chr [1:15] "3" "9" " "2"
##
   $ Market_basket_41
                         : chr [1:29] "3" "9" " "4"
   $ Market basket 42
                         : chr [1:21] "3" "9" " "4"
##
   $ Market_basket_43
                         : chr [1:11] "4" "8" " "2"
##
   $ Market basket 44
                         : chr [1:44] "3" "9" " "4"
##
   $ Market_basket_45
                         : chr [1:10] "3" "9" " "4"
   $ Market_basket_46
                         : chr [1:33] "3" "6" " " "3"
##
   $ Market_basket_47
                         : chr [1:23] "3" "9" " " "2"
##
   $ Market basket 48
                         : chr [1:29] "3" "9" " "4"
##
   $ Market basket 49
   $ Market_basket_50
                         : chr [1:4] "2" "7" "4" " "
                         : chr [1:48] "3" "2" " "3" ...
##
   $ Market_basket_51
                         : chr [1:9] "3" "9" " "4" ...
##
   $ Market_basket_52
                         : chr [1:35] "3" "8" " " "3" ...
##
   $ Market_basket_53
                         : chr [1:61] "3" "9" " "4" ...
    $ Market_basket_54
                         : chr [1:12] "3" "0" "0" " "
##
    $ Market_basket_55
##
   $ Market_basket_56
                         : chr [1:89]
                                     "3" "6" " " "3"
                         : chr [1:27] "1" "0" " " "3"
##
    $ Market_basket_57
                         : chr [1:18] "3" "9" " " "4"
##
   $ Market_basket_58
                         : chr [1:11] "3" "9" " " "3"
##
   $ Market basket 59
                         : chr [1:39] "4" "8" " " "3"
##
   $ Market_basket_60
   $ Market basket 61
                         : chr [1:51] "1" "8" " " "3"
                         : chr [1:24] "3" "2" " "3" ...
##
   $ Market_basket_62
                         : chr [1:59] "4" "8" " "3" ...
##
   $ Market_basket_63
                         : chr [1:8] "3" "6" "5" " "
##
   $ Market_basket_64
                         : chr [1:51] "3" "8" " "3" ...
   $ Market basket 65
                         : chr [1:60] "1" " "1" "1"
##
   $ Market basket 66
                                     "3" "8" "6" " "
##
   $ Market basket 67
                         : chr [1:16]
                         : chr [1:10] "3" "8" " "4"
##
   $ Market_basket_68
                                     "3" "8" " " "5"
   $ Market_basket_69
                         : chr [1:10]
                                     "3" "2" " " "4"
##
    $ Market_basket_70
                         : chr [1:58]
                                      "3" "3" "8" " "
##
   $ Market_basket_71
                         : chr [1:24]
                         : chr [1:15] "3" "9" " " "4"
##
   $ Market_basket_72
                         : chr [1:86]
                                     "4" "8" " " "8"
    $ Market_basket_73
                         : chr [1:29] "3" "9" " "4"
##
   $ Market_basket_74
                                     "1" "4" "1" " "
##
   $ Market_basket_75
                         : chr [1:28]
                         : chr [1:15] "3" "9" " "4"
   $ Market_basket_76
                         : chr [1:25] "3" "9" " "4" ...
##
   $ Market_basket_77
                         : chr [1:87] "1" "5" " "2" ...
   $ Market basket 78
```

```
: chr [1:43] "4" "8" " "4" ...
   $ Market_basket_79
                        : chr [1:61] "3" "7" " "3" ...
##
   $ Market_basket_80
                        : chr [1:22] "3" "9" " "4" ...
   $ Market_basket_81
                        : chr [1:10] "3" "9" " "4" ...
   $ Market_basket_82
                        : chr [1:12] "4" "7" "7" " " ...
##
   $ Market_basket_83
                        : chr [1:35] "3" "9" " "1" ...
##
   $ Market_basket_84
                        : chr [1:24] "3" "2" " "3" ...
##
   $ Market_basket_85
                        : chr [1:21] "3" "8" " "3" ...
##
   $ Market_basket_86
                        : chr [1:7] "6" "0" " " "3" ...
##
   $ Market_basket_87
                        : chr [1:65] "1" "1" " "3" ...
##
   $ Market_basket_88
   $ Market_basket_89
                        : chr [1:3] "3" "9" " "
                        : chr [1:11] "4" "1" " "1" ...
##
   $ Market_basket_90
                        : chr [1:28] "3" "2" " "3" ...
##
   $ Market_basket_91
                        : chr [1:10] "3" "8" " "4" ...
##
   $ Market_basket_92
                        : chr [1:56] "2" "2" "5" " " ...
##
   $ Market_basket_93
                        : chr [1:32] "3" "8" " "3" ...
##
   $ Market_basket_94
                        : chr [1:6] "3" "9" " "4" ...
##
   $ Market_basket_95
                        : chr [1:14] "3" "8" " "3" ...
   $ Market_basket_96
                        : chr [1:14] "2" " "5" "1" ...
##
   $ Market_basket_97
                        : chr [1:12] "3" "1" "0" " " ...
##
   $ Market_basket_98
                        : chr [1:11] "4" "1" " "5" ...
##
   $ Market_basket_99
     [list output truncated]
#
tail(transaction_list)
## $Market_basket_88157
   [1] "4" "8" " " "2" "0" "1" " " "2" "5" "5" " " "2" "7" "8" " " "4" "0"
## [18] "7" " "4" "7" "9" " "7" "6" "7" " "8" "2" "4" " " "9" "8" "6"
  [35] " " "1" "3" "9" "5" " " "1" "5" "9" "8" " " "2" "0" "2" "2" " " " "2"
   [52] "2" "8" "3" " " "2" "3" "7" "5" " " "6" "7" "2" "5" " " "1" "3" "3"
##
   [69] "3" "4" " "1" "4" "0" "0" "6" " " "1" "4" "0" "9" "9" " "
##
## $Market_basket_88158
   [1] "3" "9" " "8" "7" "5" " " "2" "6" "6" "5" " " "2" "9" "6" "2" " "
   [18] "1" "2" "9" "5" "9" " " "1" "4" "0" "7" "0" " " "1" "4" "4" "4" "0" "6"
   [35] " " "1" "5" "5" "1" "8" " " "1" "6" "3" "7" "9" " "
##
   $Market_basket_88159
##
     [1] "3" "9" " "4" "1" " "1" "0" "1" " "3" "4" "6" " " "3" "9" "3"
##
    [18] " " "4" "1" "3" " " "4" "7" "9" " " "5" "2" "2" " " "5" "8" "6" " "
    [35] "6" "3" "5" " "6" "9" "5" " " "7" "9" "9" " " "1" "4" "6" "6" " "
    [52] "1" "7" "8" "6" " " "1" "9" "9" "4" " "2" "4" "4" "9" " " "2" "8"
    [69] "3" "0" " " "3" "0" "3" "5" " " "3" "5" "9" "1" " " "3" "7" "2" "2"
##
    [86] " " "6" "2" "1" "7" " " "1" "1" "4" "9" "3" " " "1" "2" "1" "2" "9"
##
   [103] " " "1" "3" "0" "3" "3" " "
##
##
##
   $Market_basket_88160
    [1] "2" "3" "1" "0" " " "4" "2" "6" "7" " "
##
## $Market_basket_88161
    [1] "3" "9" " "4" "8" " "2" "5" "2" "8" " "
##
## $Market_basket_88162
   [1] "3" "2" " " "3" "9" " " "2" "0" "5" " " "2" "4" "2" " " "1" "3" "9"
```

```
## [18] "3" " "
#
# We can now clearly see the SPARSNESS of the Data
# The "" - Blanks occur eeven adjacent to each other
# seen in - $Market_basket_88159 - thus whatever Order
# is maintained in the Brick and Mortar RETAIL STORE
# is not always suggestive of Association
# Also looking at $Market_basket_88160
# [1] "2" "3" "1" "0" " "4" "2" "6" "7" " "
# we can observe a FLIP FLOP Pattern
market_basket_rules <- apriori(transaction_data, parameter=list(supp=0.001, conf=0.4))</pre>
## Apriori
##
## Parameter specification:
   confidence minval smax arem aval original Support maxtime support minlen
##
           0.4
                  0.1
                         1 none FALSE
                                                 TRUE
                                                                0.001
##
  maxlen target
                    ext
##
       10 rules FALSE
##
## Algorithmic control:
   filter tree heap memopt load sort verbose
##
       0.1 TRUE TRUE FALSE TRUE
                                         TRUE
##
## Absolute minimum support count: 88
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16470 item(s), 88162 transaction(s)] done [0.21s].
## sorting and recoding items ... [2117 item(s)] done [0.02s].
## creating transaction tree ... done [0.08s].
## checking subsets of size 1 2 3 4 5 6 done [0.23s].
## writing ... [5944 rule(s)] done [0.01s].
## creating S4 object ... done [0.03s].
```

DATA VISUALIZATION - A RULES VIZ

We now visualize the Data to make further sense of the Association Rules.

```
require(arulesViz)

## Loading required package: arulesViz

## Warning in library(package, lib.loc = lib.loc, character.only = TRUE,

## logical.return = TRUE, : there is no package called 'arulesViz'

### Errors
```