

# MO433 – Aprendizado de Máquina Não Supervisionado

## Trabalho 1

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Obs: Este relatório foi desenvolvido utilizando a linguagem R no RStudio.

```
# Importando as bibliotecas necessárias para gerar regras e visualiza-las
library(arules)
```

```
## Carregando pacotes exigidos: Matrix
```

```
##
```

```
## Attaching package: 'arules'
```

```
## The following objects are masked from 'package:base':
```

```
##
```

```
##      abbreviate, write
```

```
library(arulesViz)
```

```
# Setando o workspace
```

```
setwd("C:\\Users\\thiag\\OneDrive\\Documents\\Unicamp\\Master\\Unsupervised-Learning\\Trabalho 1")
```

Lendo o arquivo e visualizando o resumo das transações. Neste resumo podemos ver os itens mais frequentes e também a distribuição do tamanho das compras

```
transacoes <- read.transactions('retail.txt', format = "basket", sep=" ")
summary(transacoes)
```

```
## 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
```

```
##      1      2      3      4      5      6      7      8      9     10     11     12     13     14     15     16
```

```
## 3016 5516 6919 7210 6814 6163 5746 5143 4660 4086 3751 3285 2866 2620 2310 2115
```

```
##     17     18     19     20     21     22     23     24     25     26     27     28     29     30     31     32
```

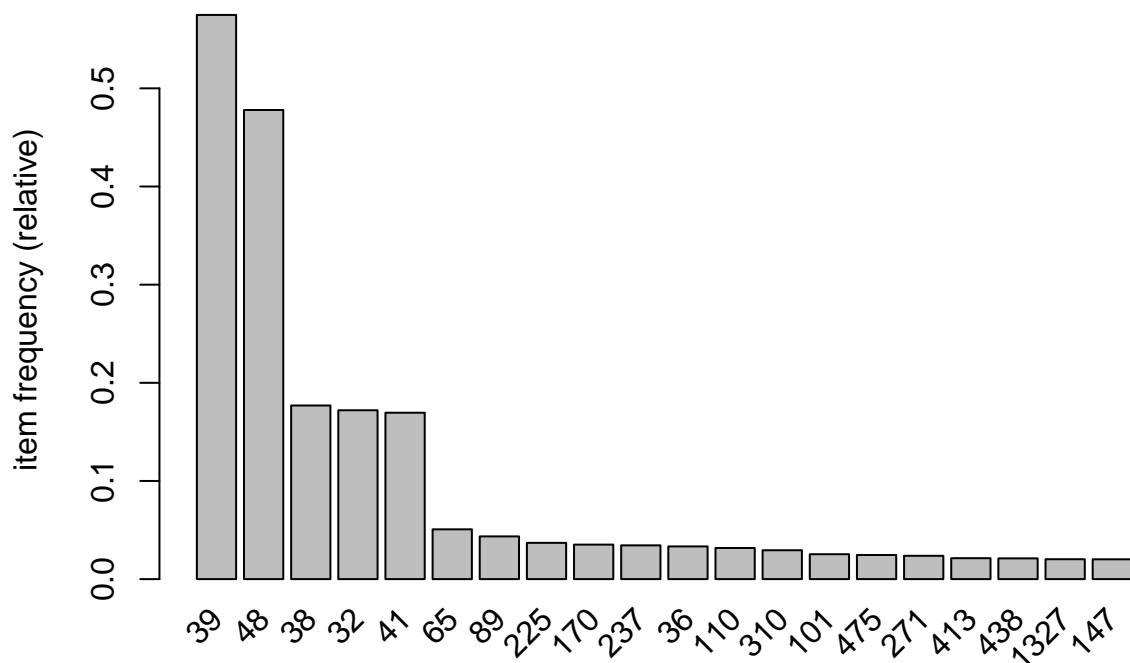
```
## 1874 1645 1469 1290 1205  981  887  819  684  586  582  472  480  355  310  303
```

```
##     33     34     35     36     37     38     39     40     41     42     43     44     45     46     47     48
```

```
## 272 234 194 136 153 123 115 112 76 66 71 60 50 44 37 37
## 49 50 51 52 53 54 55 56 57 58 59 60 61 62 63 64
## 33 22 24 21 21 10 11 10 9 11 4 9 7 4 5 2
## 65 66 67 68 71 73 74 76
## 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
```

Plotando um gráfico para melhor visualizar os itens mais frequentes do conjunto de dados. Vemos neste gráfico que os itens 39 e 48 são muito mais frequentes que os demais, tendo suporte superior a 0.4. Depois deles, apenas três itens possuem suporte superior a 0.1.

```
itemFrequencyPlot(transacoes, topN=20, support=0.005)
```



Agora vamos gerar regras utilizando o algoritmo Apriori. Através de uma lista de parâmetros nós definimos o suporte e a confiança mínima que desejamos para as regras. Na saída do comando podemos ver que foram geradas 37 regras.

```
rules <- apriori(transacoes, parameter = list(supp = 0.005, conf = 0.9, target = "rules"))
```

```
## Apriori
##
## Parameter specification:
## confidence minval smax arem aval originalSupport maxtime support minlen
##          0.9    0.1    1 none FALSE          TRUE      5  0.005      1
## maxlen target  ext
##      10  rules TRUE
##
## Algorithmic control:
## filter tree heap memopt load sort verbose
##    0.1 TRUE TRUE  FALSE TRUE    2    TRUE
##
## Absolute minimum support count: 440
##
## set item appearances ...[0 item(s)] done [0.00s].
## set transactions ...[16470 item(s), 88162 transaction(s)] done [0.99s].
## sorting and recoding items ... [221 item(s)] done [0.02s].
## creating transaction tree ... done [0.09s].
## checking subsets of size 1 2 3 4 5 done [0.05s].
## writing ... [37 rule(s)] done [0.00s].
## creating S4 object ... done [0.01s].
```

Utilizamos o comando `inspect` para visualizar as regras geradas e o comando `head` para ordená-las por lift. É notável que praticamente todas as regras, com exceção da primeira, possuem o item 38. O curioso é que o item 38 é apenas o terceiro item mais frequente do conjunto de dados.

```
inspect(head(rules, n = 37, by = "lift"))
```

	lhs	rhs	support	confidence	coverage	lift	count
## [1]	{16011}	=> {16010}	0.007384134	0.9730942	0.007588303	65.189915	651
## [2]	{110,39,48}	=> {38}	0.011694381	0.9942141	0.011762437	5.620153	1031
## [3]	{110,39,41}	=> {38}	0.005796148	0.9922330	0.005841519	5.608954	511
## [4]	{170,39,48}	=> {38}	0.013531907	0.9892206	0.013679363	5.591925	1193
## [5]	{110,39}	=> {38}	0.019736394	0.9891984	0.019951907	5.591800	1740
## [6]	{371,39}	=> {38}	0.005966289	0.9887218	0.006034346	5.589106	526
## [7]	{170,48}	=> {38}	0.017445158	0.9877970	0.017660670	5.583878	1538
## [8]	{286,39,48}	=> {38}	0.005194982	0.9870690	0.005263038	5.579762	458
## [9]	{105,39}	=> {38}	0.005092897	0.9868132	0.005160954	5.578317	449
## [10]	{110,32}	=> {38}	0.005024841	0.9866370	0.005092897	5.577320	443
## [11]	{170,41}	=> {38}	0.009006148	0.9863354	0.009130918	5.575616	794
## [12]	{110,48}	=> {38}	0.015437490	0.9862319	0.015653002	5.575030	1361
## [13]	{37,48}	=> {38}	0.006317915	0.9858407	0.006408657	5.572819	557
## [14]	{170,39,41}	=> {38}	0.006975795	0.9855769	0.007077879	5.571328	615
## [15]	{170,32}	=> {38}	0.006034346	0.9851852	0.006125088	5.569114	532
## [16]	{110,41}	=> {38}	0.007554275	0.9837518	0.007679045	5.561011	666
## [17]	{170,41,48}	=> {38}	0.005489894	0.9837398	0.005580636	5.560943	484
## [18]	{286,48}	=> {38}	0.006590141	0.9830795	0.006703568	5.557211	581
## [19]	{371}	=> {38}	0.008699893	0.9808184	0.008870035	5.544429	767
## [20]	{170,39}	=> {38}	0.022901023	0.9805731	0.023354733	5.543042	2019
## [21]	{105}	=> {38}	0.007293392	0.9786910	0.007452190	5.532403	643

## [22]	{170}	=> {38}	0.034379892	0.9780574	0.035151199	5.528821	3031
## [23]	{110}	=> {38}	0.030909008	0.9753042	0.031691659	5.513258	2725
## [24]	{37}	=> {38}	0.011864522	0.9739292	0.012182119	5.505485	1046
## [25]	{790}	=> {38}	0.005762120	0.9713193	0.005932261	5.490732	508
## [26]	{286,39}	=> {38}	0.008257526	0.9706667	0.008507067	5.487042	728
## [27]	{36,39,48}	=> {38}	0.012250176	0.9677419	0.012658515	5.470509	1080
## [28]	{37,39}	=> {38}	0.007758445	0.9674682	0.008019328	5.468962	684
## [29]	{36,39,41}	=> {38}	0.006272544	0.9667832	0.006488056	5.465090	553
## [30]	{56}	=> {38}	0.005830176	0.9607477	0.006068374	5.430972	514
## [31]	{36,48}	=> {38}	0.015426147	0.9604520	0.016061342	5.429300	1360
## [32]	{36,41}	=> {38}	0.007610989	0.9585714	0.007939929	5.418670	671
## [33]	{32,36}	=> {38}	0.005353781	0.9554656	0.005603321	5.401113	472
## [34]	{36,39}	=> {38}	0.022061659	0.9548355	0.023105193	5.397551	1945
## [35]	{36}	=> {38}	0.031646288	0.9502725	0.033302330	5.371757	2790
## [36]	{286}	=> {38}	0.012658515	0.9433643	0.013418480	5.332706	1116
## [37]	{55}	=> {38}	0.007452190	0.9332386	0.007985300	5.275467	657