

```
In [18]: #Libraries
library(arules)
library(arulesViz)
library(tidyverse)
```

```
In [22]: # Reading transactions
df <- read.transactions("../Dataset/Groceries.csv", sep=",")
```

```
In [23]: # View Transaction
inspect(df[1:10])
```

```

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

```
In [24]: # summarize whole data set
summary(df)
```

transactions as itemMatrix in sparse format with  
9835 rows (elements/itemsets/transactions) and  
169 columns (items) and a density of 0.026

most frequent items:

whole milk	other vegetables	rolls/buns	soda
2513	1903	1809	1715
yogurt	(Other)		
1372	34055		

element (itemset/transaction) length distribution:  
sizes

1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	1
6															
2159	1643	1299	1005	855	645	545	438	350	246	182	117	78	77	55	4
6															

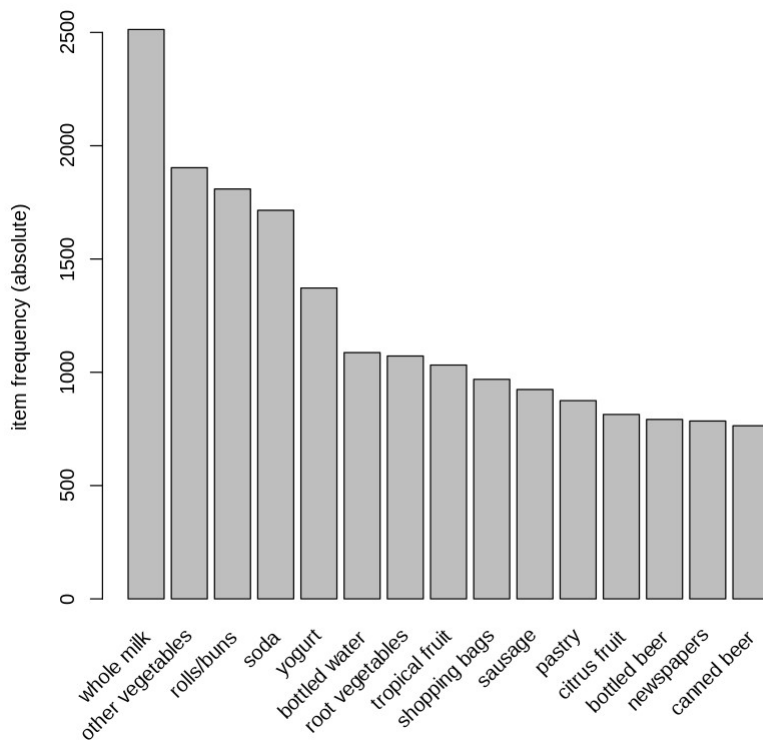
17	18	19	20	21	22	23	24	26	27	28	29	32
29	14	14	9	11	4	6	1	1	1	1	3	1

Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
1	2	3	4	6	32

includes extended item information - examples:

labels  
 1 abrasive cleaner  
 2 artif. sweetener  
 3 baby cosmetics

```
In [25]: # Frequency plot of top 15 items
itemFrequencyPlot(df, topN=15, type="absolute")
```



```
In [40]: # Get the rules
rules = apriori(df, parameter = list(supp = 0.003, conf = 0.3))
```

Apriori

Parameter specification:

confidence	minval	smax	arem	aval	originalSupport	maxtime	support	minlen
0.3	0.1	1	none	FALSE	TRUE	5	0.003	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: 29

set item appearances ...[0 item(s)] done [0.00s].  
 set transactions ...[169 item(s), 9835 transaction(s)] done [0.00s].  
 sorting and recoding items ... [136 item(s)] done [0.00s].

```
creating transaction tree ... done [0.01s].
checking subsets of size 1 2 3 4 5 done [0.01s].
writing ... [1361 rule(s)] done [0.00s].
```

```
In [41]: # Summarize the rules
summary(rules)
```

```
set of 1361 rules
```

```
rule length distribution (lhs + rhs):sizes
```

```
  2   3   4   5
148 912 291  10
```

```
    Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  2.0    3.0    3.0    3.1    3.0    5.0
```

```
summary of quality measures:
```

support	confidence	coverage	lift	count
Min. :0.003	Min. :0.30	Min. :0.004	Min. : 1.2	Min. : 30
1st Qu.:0.003	1st Qu.:0.36	1st Qu.:0.008	1st Qu.: 1.9	1st Qu.: 34
Median :0.004	Median :0.43	Median :0.010	Median : 2.2	Median : 41
Mean :0.006	Mean :0.45	Mean :0.014	Mean : 2.4	Mean : 58
3rd Qu.:0.006	3rd Qu.:0.52	3rd Qu.:0.015	3rd Qu.: 2.7	3rd Qu.: 59
Max. :0.075	Max. :0.89	Max. :0.193	Max. :11.4	Max. :736

```
mining info:
```

```
data ntransactions support confidence
df          9835    0.003         0.3
```

```
In [42]: # Print the rules
inspect(rules[1:10])
```

	lhs	rhs	support	confidence	coverage
[1]	{liquor}	=> {bottled beer}	0.0047	0.42	0.0111
[2]	{cereals}	=> {whole milk}	0.0037	0.64	0.0057
[3]	{candles}	=> {whole milk}	0.0031	0.34	0.0089
[4]	{soups}	=> {other vegetables}	0.0032	0.46	0.0068
[5]	{Instant food products}	=> {hamburger meat}	0.0031	0.38	0.0080
[6]	{Instant food products}	=> {whole milk}	0.0031	0.38	0.0080
[7]	{specialty cheese}	=> {other vegetables}	0.0043	0.50	0.0085
[8]	{specialty cheese}	=> {whole milk}	0.0038	0.44	0.0085
[9]	{chocolate marshmallow}	=> {whole milk}	0.0032	0.35	0.0090
[10]	{flower (seeds)}	=> {other vegetables}	0.0038	0.36	0.0104

	lift	count
[1]	5.2	46
[2]	2.5	36
[3]	1.3	30
[4]	2.4	31
[5]	11.4	30
[6]	1.5	30
[7]	2.6	42
[8]	1.7	37
[9]	1.4	31
[10]	1.9	37

```
In [43]: # Sort the rules by confidence
rules = sort(rules, by = "confidence")
options(digits = 2)
```

```
In [44]: inspect(rules[1:10])
```

	lhs	rhs	support	confidence	coverage	li
ft count						
[1]	{citrus fruit,					

4.6	31	{butter, root vegetables, yogurt}	=> {other vegetables}	0.0032	0.89	0.0036
[2]	30	{citrus fruit, root vegetables, tropical fruit}	=> {other vegetables}	0.0045	0.79	0.0057
3.1	44	{brown bread, other vegetables, root vegetables}	=> {whole milk}	0.0032	0.78	0.0041
[3]	31	{butter, onions}	=> {whole milk}	0.0031	0.75	0.0041
2.9	30	{curd, tropical fruit, yogurt}	=> {whole milk}	0.0040	0.75	0.0053
[6]	39	{curd, domestic eggs}	=> {whole milk}	0.0048	0.73	0.0065
2.9	47	{butter, tropical fruit, yogurt}	=> {whole milk}	0.0034	0.73	0.0046
[8]	33	{root vegetables, tropical fruit, whipped/sour cream}	=> {other vegetables}	0.0034	0.73	0.0046
2.9	33	{butter, curd}	=> {whole milk}	0.0049	0.72	0.0068

```
In [46]: # Inspect the redundant rules
print("Showing first 10 rules")
rules[is.redundant(rules)]
inspect(rules[is.redundant(rules)][1:10])
rules = rules[!is.redundant(rules)]
```

```
[1] "Showing first 10 rules"
set of 85 rules
  lhs                                rhs                                support confidence coverage li
ft count
[1] {butter,
    other vegetables,
    root vegetables} => {whole milk}    0.0042    0.63    0.0066
2.5  41
[2] {butter,
    other vegetables,
    tropical fruit}  => {whole milk}    0.0034    0.61    0.0055
2.4  33
[3] {curd,
    other vegetables,
    tropical fruit}  => {whole milk}    0.0032    0.60    0.0053
2.3  31
[4] {other vegetables,
    tropical fruit,
    whipped/sour cream} => {whole milk}  0.0045    0.57    0.0078
2.2  44
[5] {tropical fruit,
```

	whipped/sour cream, whole milk}	=> {other vegetables}	0.0045	0.56	0.0079
2.9	44				
[6]	{butter, tropical fruit, whole milk}	=> {other vegetables}	0.0034	0.54	0.0062
2.8	33				
[7]	{pastry, root vegetables, whole milk}	=> {other vegetables}	0.0031	0.54	0.0057
2.8	30				
[8]	{other vegetables, pastry, root vegetables}	=> {whole milk}	0.0031	0.52	0.0059
2.0	30				
[9]	{bottled water, tropical fruit, yogurt}	=> {whole milk}	0.0037	0.51	0.0071
2.0	36				
[10]	{other vegetables, sausage, tropical fruit}	=> {whole milk}	0.0031	0.51	0.0060

```
In [12]: inspect(rules[1:10])
```

	lhs	rhs	support	confidence	coverage	li
ft count						
[1]	{citrus fruit, root vegetables, tropical fruit, whole milk}	=> {other vegetables}	0.0032	0.89	0.0036	
4.6	31					
[2]	{butter, root vegetables, yogurt}	=> {whole milk}	0.0031	0.79	0.0039	
3.1	30					
[3]	{citrus fruit, root vegetables, tropical fruit}	=> {other vegetables}	0.0045	0.79	0.0057	
4.1	44					
[4]	{brown bread, other vegetables, root vegetables}	=> {whole milk}	0.0032	0.78	0.0041	
3.0	31					
[5]	{butter, onions}	=> {whole milk}	0.0031	0.75	0.0041	
2.9	30					
[6]	{curd, tropical fruit, yogurt}	=> {whole milk}	0.0040	0.75	0.0053	
2.9	39					
[7]	{curd, domestic eggs}	=> {whole milk}	0.0048	0.73	0.0065	
2.9	47					
[8]	{butter, tropical fruit, yogurt}	=> {whole milk}	0.0034	0.73	0.0046	
2.9	33					
[9]	{root vegetables, tropical fruit, whipped/sour cream}	=> {other vegetables}	0.0034	0.73	0.0046	
3.8	33					
[10]	{butter, curd}	=> {whole milk}	0.0049	0.72	0.0068	
2.8	48					

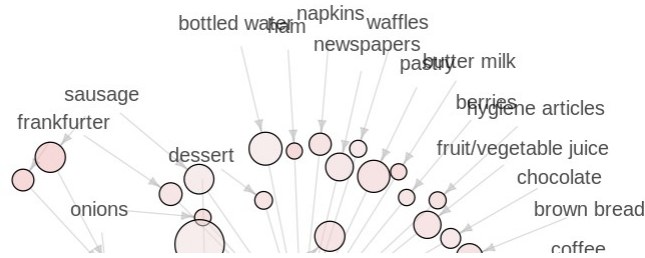
```
In [14]: # Plot the graphs for the rules
plot(rules, method = "graph")
```

Warning message:

"plot: Too many rules supplied. Only plotting the best 100 rules using 'support' (change control parameter max if needed)"

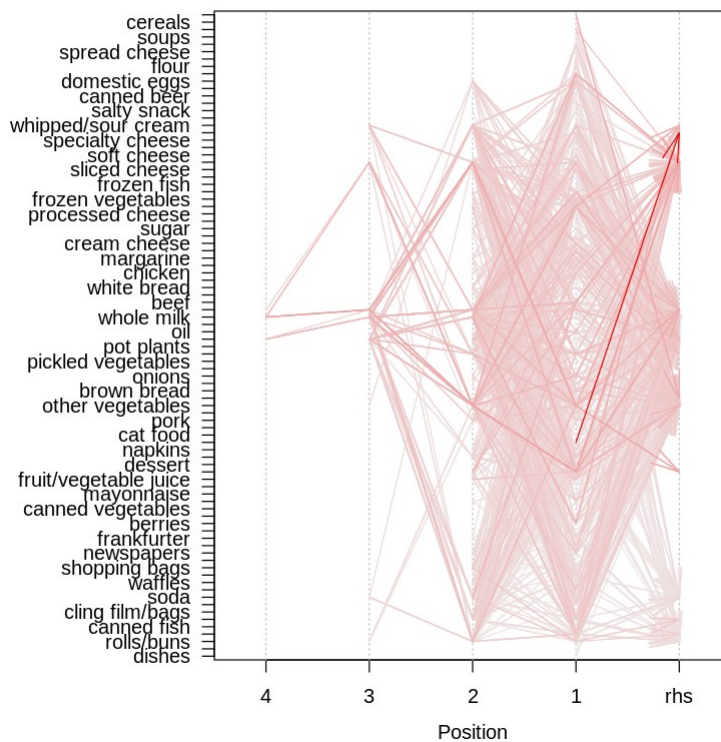
Graph for 100 rules

size: support (0.011 - 0.075)  
color: lift (1.205 - 3.145)



```
In [15]: plot(rules, method = "paracoord")
```

Parallel coordinates plot for 1276 rules



```
In [53]: plot(rules, method = "matrix", control = list(reorder = "none"))
```

Itemsets in Antecedent (LHS)

- [1] "{citrus fruit,root vegetables,tropical fruit,whole milk}"
- [2] "{butter,root vegetables,yogurt}"
- [3] "{citrus fruit,root vegetables,tropical fruit}"
- [4] "{brown bread,other vegetables,root vegetables}"
- [5] "{butter,onions}"
- [6] "{curd,tropical fruit,yogurt}"
- [7] "{curd,domestic eggs}"
- [8] "{butter,tropical fruit,yogurt}"
- [9] "{root vegetables,tropical fruit,whipped/sour cream}"
- [10] "{butter,curd}"
- [11] "{domestic eggs,sugar}"
- [12] "{other vegetables,root vegetables,tropical fruit,yogurt}"
- [13] "{baking powder,yogurt}"
- [14] "{tropical fruit,whipped/sour cream,yogurt}"
- [15] "{citrus fruit,other vegetables,root vegetables,tropical fruit}"
- [16] "{butter,pork}"

```

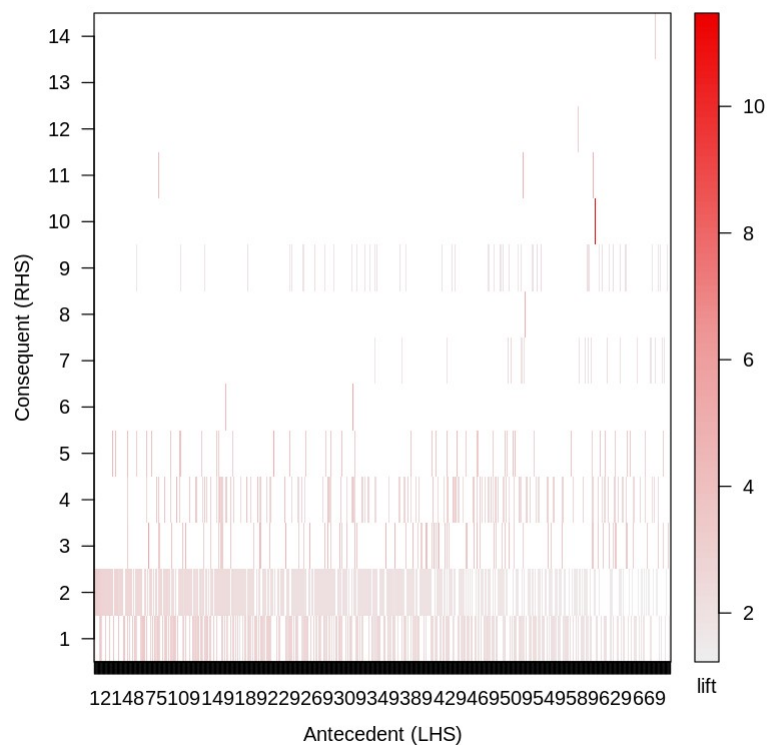
[17] "{butter,coffee}"
[18] "{domestic eggs,other vegetables,whipped/sour cream}"
[19] "{root vegetables,tropical fruit,yogurt}"
[20] "{butter,hamburger meat}"
[21] "{butter,hygiene articles}"
[22] "{butter,other vegetables,whipped/sour cream}"
[23] "{butter,other vegetables,yogurt}"
[24] "{onions,root vegetables,whole milk}"
[25] "{cream cheese,domestic eggs}"
[26] "{other vegetables,pip fruit,root vegetables}"
[27] "{sausage,tropical fruit,yogurt}"
[28] "{frozen vegetables,other vegetables,yogurt}"
[29] "{pip fruit,root vegetables,yogurt}"
[30] "{root vegetables,sliced cheese}"
.
.
...Upto 695 Antecedents

```

Itemsets in Consequent (RHS)

[1] "{other vegetables}"	"{whole milk}"	"{root vegetables}"
[4] "{yogurt}"	"{tropical fruit}"	"{citrus fruit}"
[7] "{soda}"	"{bottled beer}"	"{rolls/buns}"
[10] "{hamburger meat}"	"{whipped/sour cream}"	"{bottled water}"
[13] "{pip fruit}"	"{sausage}"	

Matrix with 1276 rules



```
In [17]: plot(rules)
```

To reduce overplotting, jitter is added! Use jitter = 0 to prevent jitter.



