

```
In [23]: import pandas as pd
import matplotlib.pyplot as plt
import numpy as np
from mlxtend.frequent_patterns import apriori, association_rules
```

```
In [24]: data = pd.read_csv("book (1).csv")
data
```

Out[24]:

	ChildBks	YouthBks	CookBks	DoItYBks	RefBks	ArtBks	GeogBks	ItalCook	ItalAtlas	Ital/
0	0	1	0	1	0	0	1	0	0	
1	1	0	0	0	0	0	0	0	0	
2	0	0	0	0	0	0	0	0	0	
3	1	1	1	0	1	0	1	0	0	
4	0	0	1	0	0	0	1	0	0	
...
1995	0	0	1	0	0	1	1	1	1	0
1996	0	0	0	0	0	0	0	0	0	0
1997	0	0	0	0	0	0	0	0	0	0
1998	0	0	1	0	0	0	0	0	0	0
1999	0	0	0	0	0	0	0	0	0	0

2000 rows × 11 columns



```
In [25]: data.shape
```

Out[25]: (2000, 11)

```
In [26]: data.isna().sum()
```

```
Out[26]: ChildBks      0
YouthBks      0
CookBks      0
DoItYBks      0
RefBks      0
ArtBks      0
GeogBks      0
ItalCook      0
ItalAtlas     0
ItalArt       0
Florence      0
dtype: int64
```

```
In [27]: data.dtypes
```

```
Out[27]: ChildBks      int64  
YouthBks      int64  
CookBks       int64  
DoItYBks      int64  
RefBks        int64  
ArtBks        int64  
GeogBks       int64  
ItalCook      int64  
ItalAtlas     int64  
ItalArt       int64  
Florence      int64  
dtype: object
```

```
In [28]: data.describe(include='all')
```

```
Out[28]:
```

	ChildBks	YouthBks	CookBks	DoItYBks	RefBks	ArtBks	GeogBks
count	2000.000000	2000.000000	2000.000000	2000.000000	2000.000000	2000.000000	2000.000000
mean	0.423000	0.247500	0.43100	0.282000	0.214500	0.241000	0.276000
std	0.494159	0.431668	0.49534	0.450086	0.410578	0.427797	0.447129
min	0.000000	0.000000	0.00000	0.000000	0.000000	0.000000	0.000000
25%	0.000000	0.000000	0.00000	0.000000	0.000000	0.000000	0.000000
50%	0.000000	0.000000	0.00000	0.000000	0.000000	0.000000	0.000000
75%	1.000000	0.000000	1.00000	1.000000	0.000000	0.000000	1.000000
max	1.000000	1.000000	1.00000	1.000000	1.000000	1.000000	1.000000

```
In [29]: freq_items = apriori(data,min_support=0.005,use_colnames=True)
freq_items
```

Out[29]:

	support	itemsets
0	0.4230	(ChildBks)
1	0.2475	(YouthBks)
2	0.4310	(CookBks)
3	0.2820	(DoltYBks)
4	0.2145	(RefBks)
...
1057	0.0060	(YouthBks, RefBks, ItalAtlas, ItalArt, ArtBks,...
1058	0.0050	(RefBks, DoltYBks, ItalArt, ArtBks, ChildBks, ...
1059	0.0065	(RefBks, DoltYBks, ItalAtlas, ItalArt, ArtBks,...
1060	0.0080	(RefBks, ItalAtlas, ItalArt, ArtBks, ChildBks,...
1061	0.0050	(RefBks, DoltYBks, ItalAtlas, ItalArt, ArtBks,...

1062 rows × 2 columns

```
In [30]: rules = association_rules(freq_items,metric='lift',min_threshold=1)
rules
```

Out[30]:

	antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage
0	(YouthBks)	(ChildBks)	0.2475	0.4230	0.165	0.666667	1.576044	0.06031
1	(ChildBks)	(YouthBks)	0.4230	0.2475	0.165	0.390071	1.576044	0.06031
2	(CookBks)	(ChildBks)	0.4310	0.4230	0.256	0.593968	1.404179	0.07361
3	(ChildBks)	(CookBks)	0.4230	0.4310	0.256	0.605201	1.404179	0.07361
4	(ChildBks)	(DoltYBks)	0.4230	0.2820	0.184	0.434988	1.542511	0.06471
...
35293	(ItalArt)	(RefBks, DoltYBks, ItalAtlas, ArtBks, ItalCook...	0.0485	0.0050	0.005	0.103093	20.618557	0.00471
35294	(ArtBks)	(RefBks, DoltYBks, ItalAtlas, ItalArt, ItalCoo...	0.2410	0.0050	0.005	0.020747	4.149378	0.00371
35295	(ItalCook)	(RefBks, DoltYBks, ItalAtlas, ItalArt, ArtBks,...	0.1135	0.0050	0.005	0.044053	8.810573	0.00441
35296	(GeogBks)	(RefBks, DoltYBks, ItalAtlas, ItalArt, ArtBks,...	0.2760	0.0075	0.005	0.018116	2.415459	0.00291
35297	(CookBks)	(RefBks, DoltYBks, ItalAtlas, ItalArt, ArtBks,...	0.4310	0.0050	0.005	0.011601	2.320186	0.00281

35298 rows × 9 columns



```
In [31]: rules[(rules['lift']>=6) & (rules['confidence'] >=.8)]
```

```
Out[31]:
```

	antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage
562	(YouthBks, ItalArt)	(ItalCook)	0.0230	0.1135	0.0190	0.826087	7.278299	0.01639
719	(CookBks, ItalAtlas)	(ItalCook)	0.0285	0.1135	0.0230	0.807018	7.110287	0.01976
724	(CookBks, ItalArt)	(ItalCook)	0.0410	0.1135	0.0375	0.914634	8.058451	0.03284
846	(ItalArt, DoltYBks)	(ItalCook)	0.0300	0.1135	0.0250	0.833333	7.342144	0.02151
930	(RefBks, ItalArt)	(ItalCook)	0.0200	0.1135	0.0160	0.800000	7.048458	0.01371
...
35121	(DoltYBks, ItalAtlas, ArtBks, GeogBks, ItalCook)	(CookBks, RefBks, ItalArt)	0.0050	0.0165	0.0050	1.000000	60.606061	0.00491
35123	(DoltYBks, ItalAtlas, ArtBks, GeogBks, CookBks)	(ItalCook, RefBks, ItalArt)	0.0050	0.0160	0.0050	1.000000	62.500000	0.00491
35143	(GeogBks, RefBks, ItalArt, DoltYBks)	(ItalCook, CookBks, ArtBks, ItalAtlas)	0.0060	0.0130	0.0050	0.833333	64.102564	0.00491
35173	(GeogBks, ItalArt, DoltYBks, ItalAtlas)	(ItalCook, CookBks, RefBks, ArtBks)	0.0055	0.0235	0.0050	0.909091	38.684720	0.00481
35176	(GeogBks, ArtBks, DoltYBks, ItalAtlas)	(ItalCook, CookBks, RefBks, ItalArt)	0.0055	0.0160	0.0050	0.909091	56.818182	0.00491

1198 rows × 9 columns



```
In [32]: freq_items_1 = apriori(data,min_support=0.01,use_colnames=True)
freq_items_1
```

Out[32]:

	support	itemsets
0	0.4230	(ChildBks)
1	0.2475	(YouthBks)
2	0.4310	(CookBks)
3	0.2820	(DoltYBks)
4	0.2145	(RefBks)
...
589	0.0125	(RefBks, ItalAtlas, ItalArt, ArtBks, ItalCook,...
590	0.0145	(YouthBks, RefBks, DoltYBks, ChildBks, ArtBks,...
591	0.0105	(DoltYBks, ItalArt, ArtBks, ChildBks, ItalCook...
592	0.0100	(RefBks, ItalArt, ArtBks, ChildBks, ItalCook, ...
593	0.0110	(RefBks, ItalAtlas, ItalArt, ArtBks, ChildBks,...

594 rows × 2 columns

```
In [33]: rules[(rules['lift']>=6) & (rules['confidence'] >=.8)]
```

```
Out[33]:
```

	antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage
562	(YouthBks, ItalArt)	(ItalCook)	0.0230	0.1135	0.0190	0.826087	7.278299	0.01639
719	(CookBks, ItalAtlas)	(ItalCook)	0.0285	0.1135	0.0230	0.807018	7.110287	0.01976
724	(CookBks, ItalArt)	(ItalCook)	0.0410	0.1135	0.0375	0.914634	8.058451	0.03284
846	(ItalArt, DoltYBks)	(ItalCook)	0.0300	0.1135	0.0250	0.833333	7.342144	0.02151
930	(RefBks, ItalArt)	(ItalCook)	0.0200	0.1135	0.0160	0.800000	7.048458	0.01371
...
35121	(DoltYBks, ItalAtlas, ArtBks, GeogBks, ItalCook)	(CookBks, RefBks, ItalArt)	0.0050	0.0165	0.0050	1.000000	60.606061	0.00491
35123	(DoltYBks, ItalAtlas, ArtBks, GeogBks, CookBks)	(ItalCook, RefBks, ItalArt)	0.0050	0.0160	0.0050	1.000000	62.500000	0.00491
35143	(GeogBks, RefBks, ItalArt, DoltYBks)	(ItalCook, CookBks, ArtBks, ItalAtlas)	0.0060	0.0130	0.0050	0.833333	64.102564	0.00491
35173	(GeogBks, ItalArt, DoltYBks, ItalAtlas)	(ItalCook, CookBks, RefBks, ArtBks)	0.0055	0.0235	0.0050	0.909091	38.684720	0.00481
35176	(GeogBks, ArtBks, DoltYBks, ItalAtlas)	(ItalCook, CookBks, RefBks, ItalArt)	0.0055	0.0160	0.0050	0.909091	56.818182	0.00491

1198 rows × 9 columns



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In [ ]:
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