

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from mlxtend.frequent_patterns import apriori, association_rules
from mlxtend.preprocessing import TransactionEncoder
```

```
In [2]: data=pd.read_csv("my_movies.csv")
data.head()
```

Out [2]:

| | V1 | V2 | V3 | V4 | V5 | Sixth Sense | Gladiator | LOTR1 | Harry Potter1 | Patriot |
|---|-------------|---------|---------------|------------|-------|-------------|-----------|-------|---------------|---------|
| 0 | Sixth Sense | LOTR1 | Harry Potter1 | Green Mile | LOTR2 | 1 | 0 | 1 | 1 | 0 |
| 1 | Gladiator | Patriot | Braveheart | NaN | NaN | 0 | 1 | 0 | 0 | 1 |
| 2 | LOTR1 | LOTR2 | NaN | NaN | NaN | 0 | 0 | 1 | 0 | 0 |
| 3 | Gladiator | Patriot | Sixth Sense | NaN | NaN | 1 | 1 | 0 | 0 | 1 |
| 4 | Gladiator | Patriot | Sixth Sense | NaN | NaN | 1 | 1 | 0 | 0 | 1 |

```
In [3]: data.describe()
```

Out [3]:

| | Sixth Sense | Gladiator | LOTR1 | Harry Potter1 | Patriot | LOTR2 | Harry Potter2 | LOTR3 |
|-------|-------------|-----------|-----------|---------------|-----------|-----------|---------------|-----------|
| count | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 |
| mean | 0.600000 | 0.700000 | 0.200000 | 0.200000 | 0.600000 | 0.200000 | 0.100000 | 0.100000 |
| std | 0.516398 | 0.483046 | 0.421637 | 0.421637 | 0.516398 | 0.421637 | 0.316228 | 0.316228 |
| min | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 |
| 25% | 0.000000 | 0.250000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 | 0.000000 |
| 50% | 1.000000 | 1.000000 | 0.000000 | 0.000000 | 1.000000 | 0.000000 | 0.000000 | 0.000000 |
| 75% | 1.000000 | 1.000000 | 0.000000 | 0.000000 | 1.000000 | 0.000000 | 0.000000 | 0.000000 |
| max | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 1.000000 |

```
In [4]: data.shape
```

Out [4]: (10, 15)

```
In [5]: data.isnull().sum()
```

```
Out[5]: V1                0
        V2                0
        V3                3
        V4                8
        V5                9
        Sixth Sense      0
        Gladiator        0
        LOTR1            0
        Harry Potter1    0
        Patriot          0
        LOTR2            0
        Harry Potter2    0
        LOTR             0
        Braveheart       0
        Green Mile       0
        dtype: int64
```

```
In [6]: data.dtypes
```

```
Out[6]: V1                object
        V2                object
        V3                object
        V4                object
        V5                object
        Sixth Sense      int64
        Gladiator        int64
        LOTR1            int64
        Harry Potter1    int64
        Patriot          int64
        LOTR2            int64
        Harry Potter2    int64
        LOTR             int64
        Braveheart       int64
        Green Mile       int64
        dtype: object
```

```
In [8]: data1=data.iloc[:,5:]
data1
```

Out[8]:

| | Sixth Sense | Gladiator | LOTR1 | Harry Potter1 | Patriot | LOTR2 | Harry Potter2 | LOTR | Braveheart | Green Mile |
|---|-------------|-----------|-------|---------------|---------|-------|---------------|------|------------|------------|
| 0 | 1 | 0 | 1 | 1 | 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| 2 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| 3 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 4 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 5 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 6 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| 7 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 8 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 9 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 1 |

```
In [9]: data1[data1.duplicated()]
```

Out[9]:

| | Sixth Sense | Gladiator | LOTR1 | Harry Potter1 | Patriot | LOTR2 | Harry Potter2 | LOTR | Braveheart | Green Mile |
|---|-------------|-----------|-------|---------------|---------|-------|---------------|------|------------|------------|
| 4 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 5 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 8 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |

```
In [10]: data2=data1.drop_duplicates()
data2
```

Out[10]:

| | Sixth Sense | Gladiator | LOTR1 | Harry Potter1 | Patriot | LOTR2 | Harry Potter2 | LOTR | Braveheart | Green Mile |
|---|-------------|-----------|-------|---------------|---------|-------|---------------|------|------------|------------|
| 0 | 1 | 0 | 1 | 1 | 0 | 1 | 0 | 0 | 0 | 1 |
| 1 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| 2 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| 3 | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 6 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| 7 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 |
| 9 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 1 |

```
In [11]: data2.isnull().sum()
```

```
Out[11]: Sixth Sense      0
          Gladiator      0
          LOTR1          0
          Harry Potter1   0
          Patriot        0
          LOTR2          0
          Harry Potter2   0
          LOTR            0
          Braveheart     0
          Green Mile      0
          dtype: int64
```

```
In [12]: frequent_itemsets = apriori(data2,min_support = 0.1,use_colnames=True)
          frequent_itemsets
```

```
/opt/anaconda3/lib/python3.9/site-packages/mlxtend/frequent_patterns/fpcommon.py:111: DeprecationWarning: DataFrames with non-bool types result in worse computational performance and their support might be discontinued in the future.Please use a DataFrame with bool type
warnings.warn(
```

```
Out[12]:
```

| | support | itemsets |
|----|----------|------------------------------|
| 0 | 0.428571 | (Sixth Sense) |
| 1 | 0.571429 | (Gladiator) |
| 2 | 0.285714 | (LOTR1) |
| 3 | 0.285714 | (Harry Potter1) |
| 4 | 0.428571 | (Patriot) |
| 5 | 0.285714 | (LOTR2) |
| 6 | 0.142857 | (Harry Potter2) |
| 7 | 0.142857 | (LOTR) |
| 8 | 0.142857 | (Braveheart) |
| 9 | 0.285714 | (Green Mile) |
| 10 | 0.285714 | (Gladiator, Sixth Sense) |
| 11 | 0.142857 | (LOTR1, Sixth Sense) |
| 12 | 0.142857 | (Harry Potter1, Sixth Sense) |
| 13 | 0.142857 | (Patriot, Sixth Sense) |
| 14 | 0.142857 | (Sixth Sense, LOTR2) |
| 15 | 0.142857 | (Sixth Sense, LOTR) |
| 16 | 0.285714 | (Sixth Sense, Green Mile) |

| | | |
|----|----------|---|
| 17 | 0.428571 | (Patriot, Gladiator) |
| 18 | 0.142857 | (Gladiator, LOTR) |
| 19 | 0.142857 | (Gladiator, Braveheart) |
| 20 | 0.142857 | (Gladiator, Green Mile) |
| 21 | 0.142857 | (LOTR1, Harry Potter1) |
| 22 | 0.285714 | (LOTR1, LOTR2) |
| 23 | 0.142857 | (LOTR1, Green Mile) |
| 24 | 0.142857 | (Harry Potter1, LOTR2) |
| 25 | 0.142857 | (Harry Potter1, Harry Potter2) |
| 26 | 0.142857 | (Harry Potter1, Green Mile) |
| 27 | 0.142857 | (Patriot, Braveheart) |
| 28 | 0.142857 | (LOTR2, Green Mile) |
| 29 | 0.142857 | (LOTR, Green Mile) |
| 30 | 0.142857 | (Patriot, Gladiator, Sixth Sense) |
| 31 | 0.142857 | (Gladiator, Sixth Sense, LOTR) |
| 32 | 0.142857 | (Gladiator, Sixth Sense, Green Mile) |
| 33 | 0.142857 | (LOTR1, Harry Potter1, Sixth Sense) |
| 34 | 0.142857 | (LOTR1, Sixth Sense, LOTR2) |
| 35 | 0.142857 | (LOTR1, Sixth Sense, Green Mile) |
| 36 | 0.142857 | (Harry Potter1, Sixth Sense, LOTR2) |
| 37 | 0.142857 | (Harry Potter1, Sixth Sense, Green Mile) |
| 38 | 0.142857 | (LOTR2, Sixth Sense, Green Mile) |
| 39 | 0.142857 | (Sixth Sense, LOTR, Green Mile) |
| 40 | 0.142857 | (Gladiator, Braveheart, Patriot) |
| 41 | 0.142857 | (Gladiator, LOTR, Green Mile) |
| 42 | 0.142857 | (LOTR1, Harry Potter1, LOTR2) |
| 43 | 0.142857 | (LOTR1, Harry Potter1, Green Mile) |
| 44 | 0.142857 | (LOTR1, LOTR2, Green Mile) |
| 45 | 0.142857 | (LOTR2, Harry Potter1, Green Mile) |
| 46 | 0.142857 | (Gladiator, Sixth Sense, LOTR, Green Mile) |
| 47 | 0.142857 | (LOTR1, Harry Potter1, Sixth Sense, LOTR2) |
| 48 | 0.142857 | (LOTR1, Harry Potter1, Sixth Sense, Green Mile) |
| 49 | 0.142857 | (LOTR1, LOTR2, Sixth Sense, Green Mile) |
| 50 | 0.142857 | (LOTR2, Harry Potter1, Sixth Sense, Green Mile) |

51 0.142857 (LOTR1, LOTR2, Harry Potter1, Green Mile)

52 0.142857 (LOTR1, LOTR2, Harry Potter1, Sixth Sense, Gre...

In [13]: `rules = association_rules(frequent_itemsets, metric='lift', min_thres
rules`

Out [13]:

| | antecedents | consequents | antecedent support | consequent support | support | confidence | lift | I |
|-----|-----------------|---|-----------------------|-----------------------|----------|------------|----------|-----|
| 0 | (Gladiator) | (Sixth Sense) | 0.571429 | 0.428571 | 0.285714 | 0.500000 | 1.166667 | (|
| 1 | (Sixth Sense) | (Gladiator) | 0.428571 | 0.571429 | 0.285714 | 0.666667 | 1.166667 | (|
| 2 | (LOTR1) | (Sixth Sense) | 0.285714 | 0.428571 | 0.142857 | 0.500000 | 1.166667 | (|
| 3 | (Sixth Sense) | (LOTR1) | 0.428571 | 0.285714 | 0.142857 | 0.333333 | 1.166667 | (|
| 4 | (Harry Potter1) | (Sixth Sense) | 0.285714 | 0.428571 | 0.142857 | 0.500000 | 1.166667 | (|
| ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 245 | (LOTR1) | (Green Mile, Harry Potter1, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 246 | (LOTR2) | (LOTR1, Harry Potter1, Sixth Sense, Green Mile) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 247 | (Harry Potter1) | (LOTR1, Green Mile, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 248 | (Sixth Sense) | (LOTR1, Green Mile, Harry Potter1, LOTR2) | 0.428571 | 0.142857 | 0.142857 | 0.333333 | 2.333333 | (|
| 249 | (Green Mile) | (LOTR1, Harry Potter1, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|

250 rows × 9 columns

In [14]: `rules1=rules.sort_values('lift', ascending = False)[0:20]`

In [15]: `rules[rules.lift>1]`

Out[15]:

| | antecedents | consequents | antecedent support | consequent support | support | confidence | lift | |
|-----|-----------------|---|-----------------------|-----------------------|----------|------------|----------|-----|
| 0 | (Gladiator) | (Sixth Sense) | 0.571429 | 0.428571 | 0.285714 | 0.500000 | 1.166667 | (|
| 1 | (Sixth Sense) | (Gladiator) | 0.428571 | 0.571429 | 0.285714 | 0.666667 | 1.166667 | (|
| 2 | (LOTR1) | (Sixth Sense) | 0.285714 | 0.428571 | 0.142857 | 0.500000 | 1.166667 | (|
| 3 | (Sixth Sense) | (LOTR1) | 0.428571 | 0.285714 | 0.142857 | 0.333333 | 1.166667 | (|
| 4 | (Harry Potter1) | (Sixth Sense) | 0.285714 | 0.428571 | 0.142857 | 0.500000 | 1.166667 | (|
| ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 245 | (LOTR1) | (Green Mile, Harry Potter1, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 246 | (LOTR2) | (LOTR1, Harry Potter1, Sixth Sense, Green Mile) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 247 | (Harry Potter1) | (LOTR1, Green Mile, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|
| 248 | (Sixth Sense) | (LOTR1, Green Mile, Harry Potter1, LOTR2) | 0.428571 | 0.142857 | 0.142857 | 0.333333 | 2.333333 | (|
| 249 | (Green Mile) | (LOTR1, Harry Potter1, Sixth Sense, LOTR2) | 0.285714 | 0.142857 | 0.142857 | 0.500000 | 3.500000 | (|

242 rows × 9 columns

```
In [16]: rules3 =rules[(rules['lift']>1)&(rules['confidence']>0.7)]
rules3
```

Out[16]:

| | antecedents | consequents | antecedent support | consequent support | support | confidence | lift | |
|------------|------------------------------------|--|-----------------------|-----------------------|----------|------------|----------|---|
| 11 | (LOTR) | (Sixth Sense) | 0.142857 | 0.428571 | 0.142857 | 1.00 | 2.333333 | (|
| 13 | (Green Mile) | (Sixth Sense) | 0.285714 | 0.428571 | 0.285714 | 1.00 | 2.333333 | (|
| 14 | (Patriot) | (Gladiator) | 0.428571 | 0.571429 | 0.428571 | 1.00 | 1.750000 | (|
| 15 | (Gladiator) | (Patriot) | 0.571429 | 0.428571 | 0.428571 | 0.75 | 1.750000 | (|
| 17 | (LOTR) | (Gladiator) | 0.142857 | 0.571429 | 0.142857 | 1.00 | 1.750000 | (|
| ... | ... | ... | ... | ... | ... | ... | ... | |
| 239 | (Harry Potter1, LOTR2) | (LOTR1, Sixth Sense, Green Mile) | 0.142857 | 0.142857 | 0.142857 | 1.00 | 7.000000 | (|
| 240 | (Sixth Sense, LOTR2) | (LOTR1, Harry Potter1, Green Mile) | 0.142857 | 0.142857 | 0.142857 | 1.00 | 7.000000 | (|
| 241 | (Green Mile, LOTR2) | (LOTR1, Harry Potter1, Sixth Sense) | 0.142857 | 0.142857 | 0.142857 | 1.00 | 7.000000 | (|
| 242 | (Harry Potter1, Sixth Sense) | (LOTR1, Green Mile, LOTR2) | 0.142857 | 0.142857 | 0.142857 | 1.00 | 7.000000 | (|
| 243 | (Harry Potter1, Green Mile) | (LOTR1, Sixth Sense, LOTR2) | 0.142857 | 0.142857 | 0.142857 | 1.00 | 7.000000 | (|

126 rows × 9 columns

In [17]: `freq2_mov=apriori(data2,min_support=0.2,use_colnames=True)`
`freq2_mov`

/opt/anaconda3/lib/python3.9/site-packages/mlxtend/frequent_patterns/fpcommon.py:111: DeprecationWarning: DataFrames with non-bool types result in worse computational performance and their support might be discontinued in the future. Please use a DataFrame with bool type
 warnings.warn(

Out [17]:

| | support | itemsets |
|----|----------|---------------------------|
| 0 | 0.428571 | (Sixth Sense) |
| 1 | 0.571429 | (Gladiator) |
| 2 | 0.285714 | (LOTR1) |
| 3 | 0.285714 | (Harry Potter1) |
| 4 | 0.428571 | (Patriot) |
| 5 | 0.285714 | (LOTR2) |
| 6 | 0.285714 | (Green Mile) |
| 7 | 0.285714 | (Gladiator, Sixth Sense) |
| 8 | 0.285714 | (Sixth Sense, Green Mile) |
| 9 | 0.428571 | (Patriot, Gladiator) |
| 10 | 0.285714 | (LOTR1, LOTR2) |

In [18]: `rules4=association_rules(freq2_mov,metric='confidence',min_threshold=0.6)`
`rules4`

Out [18]:

| | antecedents | consequents | antecedent support | consequent support | support | confidence | lift | lev |
|---|---------------|---------------|--------------------|--------------------|----------|------------|----------|-----|
| 0 | (Sixth Sense) | (Gladiator) | 0.428571 | 0.571429 | 0.285714 | 0.666667 | 1.166667 | 0.0 |
| 1 | (Sixth Sense) | (Green Mile) | 0.428571 | 0.285714 | 0.285714 | 0.666667 | 2.333333 | 0.1 |
| 2 | (Green Mile) | (Sixth Sense) | 0.285714 | 0.428571 | 0.285714 | 1.000000 | 2.333333 | 0.1 |
| 3 | (Patriot) | (Gladiator) | 0.428571 | 0.571429 | 0.428571 | 1.000000 | 1.750000 | 0.1 |
| 4 | (Gladiator) | (Patriot) | 0.571429 | 0.428571 | 0.428571 | 0.750000 | 1.750000 | 0.1 |
| 5 | (LOTR1) | (LOTR2) | 0.285714 | 0.285714 | 0.285714 | 1.000000 | 3.500000 | 0.2 |
| 6 | (LOTR2) | (LOTR1) | 0.285714 | 0.285714 | 0.285714 | 1.000000 | 3.500000 | 0.2 |

```
In [19]: rules4[rules4.lift>1]
```

```
Out[19]:
```

| | antecedents | consequents | antecedent support | consequent support | support | confidence | lift | lev |
|---|---------------|---------------|-----------------------|-----------------------|----------|------------|----------|-----|
| 0 | (Sixth Sense) | (Gladiator) | 0.428571 | 0.571429 | 0.285714 | 0.666667 | 1.166667 | 0.0 |
| 1 | (Sixth Sense) | (Green Mile) | 0.428571 | 0.285714 | 0.285714 | 0.666667 | 2.333333 | 0.1 |
| 2 | (Green Mile) | (Sixth Sense) | 0.285714 | 0.428571 | 0.285714 | 1.000000 | 2.333333 | 0.1 |
| 3 | (Patriot) | (Gladiator) | 0.428571 | 0.571429 | 0.428571 | 1.000000 | 1.750000 | 0.1 |
| 4 | (Gladiator) | (Patriot) | 0.571429 | 0.428571 | 0.428571 | 0.750000 | 1.750000 | 0.1 |
| 5 | (LOTR1) | (LOTR2) | 0.285714 | 0.285714 | 0.285714 | 1.000000 | 3.500000 | 0.2 |
| 6 | (LOTR2) | (LOTR1) | 0.285714 | 0.285714 | 0.285714 | 1.000000 | 3.500000 | 0.2 |

Conclusion

Lower the Confidence level Higher the no. of rules. Higher the Support, lower the no. of rules.

```
In [ ]:
```