

Affinity Analysis

— Co-Occurrences → Medical

Bread, Butter, Eggs.

— Things that go together / Symphuse
Symptom1: (Heart-disease)

Laptop, Antivirus.

— 'Market Basket Analysis' (Obesity)

Mobile, Cover, Screen Guard.

— 'Association Rule Mining'.

Association Rule:

Ip: Set of transactions

O/p: 'Actionable Rules'

'Meaningful'

If {Breads} → {Butter, Eggs}

Antecedent

Consequent

If {Laptop} → {Antivirus}

If {Antecedent} Then {Consequent}

(A)

(C)

Prod A × × × Prod B



→ product placement
→ offers

Metrics .

If $\{A\} \rightarrow \{C\}$.
 ↓ ↓
 Antecedent Consequent

(a) Support $= \frac{\#(A, C)}{\#(\text{total transactions})}$

If $\{Bread\} \rightarrow \{Butter\}$

\rightarrow Frequency

10 \rightarrow transaction

(b) Confidence $= \frac{\#(A, C)}{\#(A)}$

$S = \frac{8}{10} = 80\%$

$C = \frac{6 \cdot (\text{Butter also})}{8 \cdot (\text{Bread})}$
 $= 75\%$

(c) Lift: $\Rightarrow \frac{\text{confidence}}{\text{Benchmark confidence}}$

$\hookrightarrow \frac{\#C}{\text{total no. of transaction}}$

Apriori Algorithm -

Item Set \rightarrow set of items.

1-item itemset = {Bread}.

2-item itemset = {Bread, Jam}.

3-item itemset = {Bread, Jam, Eggs}.

Apriori Rule:

"If an itemset is 'frequent', then all its subsets
should also be frequent."

"Frequent Itemset" \rightarrow Support shld meet a
min-threshold value.

\rightarrow Min-support (70%)

$$\text{Support} = \frac{1}{100}.$$

\Rightarrow Frequency

\Rightarrow 1/1.

if {Bread} Then {Jam}. Min-support = 70%.

[16.05 am]

{Bread, Jam} \rightarrow support -
↳ Support > Min-support
↳ Frequent Itemset.

Subsets.

{Bread, Butter, Jam} \rightarrow {Butter} \rightarrow Frequent
{Jam} \rightarrow "
{Bread} \rightarrow "
{Bread, Butter} \rightarrow "
{Butter, Jam} \rightarrow "
{Jam, Bread} \rightarrow "

Min-support = 2 (2/9)

Tid

Item list

| | |
|---|--------------------------------|
| 1 | $I_1 I_2 I_5$ |
| 2 | $I_2 I_4$ |
| 3 | $I_2 I_3$ |
| 4 | $I_1 I_2 I_4$ |
| 5 | $I_1 I_3$ |
| 6 | $I_2 I_4$ |
| 7 | $I_1 I_4$ |
| 8 | $I_1 I_2 I_3 I_5 \checkmark 1$ |
| 9 | $I_1 I_2 I_3 - 1$ |

1-item itemset ↗

$\{I_1\} = 6 \checkmark$

$\{I_2\} = 7$

$\{I_3\} = 4$

$\{I_4\} = 4$

$\{I_5\} = 2$

2-item itemsets

| |
|---------------|
| $I_1 I_2 = 4$ |
| $I_1 I_3 = 3$ |
| $I_1 I_4 = 2$ |
| $I_1 I_5 = 2$ |
| $I_2 I_3 = 3$ |
| $I_2 I_4 = 2$ |
| $I_2 I_5 = 2$ |
| $I_3 I_4 = 0$ |
| $I_3 I_5 = 1$ |
| $I_4 I_5 = 0$ |

3-item item

| |
|--|
| $I_1 I_2 I_3 \rightarrow 2 \checkmark$ |
| $I_1 I_2 I_4 \rightarrow 1 \times$ |
| $I_1 I_2 I_5 \rightarrow 2 \checkmark$ |
| $I_1 I_3 I_4 \rightarrow 0 \times$ |
| $I_1 I_3 I_5 \rightarrow 1 \times$ |
| $I_1 I_4 I_5 \rightarrow 0$ |

freq. 3-item
itemset

Frequent
itemset

Four-item itemset

$I_1 I_2 I_3 I_5 \rightarrow 1$

✓
 $\{ I_1, I_2, I_3 \}$

Min. confidence = 60%

$\{ I_1, I_2, I_5 \} \rightarrow 2$

$$A \quad C \\ I_1 \{ I_1 \rightarrow I_2, I_3 \} = \frac{\{ I_1, I_2, I_3 \}}{\# \{ I_1 \}} = \frac{2}{6} = 33.33\%$$

Confidence

lift

$$\{ I_2 \rightarrow I_1, I_3 \} = 2/7 = 28.5\%$$

1.5

$$\{ I_3 \rightarrow I_1, I_2 \} = 2/4 = 50\%$$

2.3

$$\{ I_2, I_3 \rightarrow I_1 \} \Rightarrow 2/3 = 66.66\%$$

$$\{ I_1, I_3 \rightarrow I_2 \} \Rightarrow 2/3 = 66.66\%$$

$$\{ I_1, I_2 \rightarrow I_3 \} \Rightarrow 2/4 = 50\%$$

$$\begin{array}{lll} I_2, I_3 \rightarrow I_1 & 66.66\% \\ \Rightarrow I_1, I_3 \rightarrow I_2 & 66.66\% \end{array}$$

Valid Rules:

$I_2, I_3 \rightarrow I_1 \rightarrow \checkmark$

$I_1, I_3 \rightarrow I_2 \rightarrow$



Consequent \rightarrow very frequent
 \rightarrow High Confidence

\Rightarrow 84 trans.
 $80 \rightarrow$ Milk
 $14 \rightarrow$ toothbrush

If {toothbrush} \rightarrow {Milk}.

A
Frequent
Itemset

10 / 14

Confidence =

$$\Rightarrow 0.71.$$

$$\Rightarrow \underline{71\%}$$

$$\text{Lift} = \frac{0.71}{0.95}$$

$$\text{Lift} \Rightarrow 0.74$$

$$\text{Lift} = \frac{\text{Confidence}}{\text{Benchmark Confidence}}$$

\hookrightarrow Support for C!

$$= \frac{(\# A, c) / (\# k)}{(\# c) / \# \text{(total transactions)}}$$

$$\begin{aligned} \text{Benchmark Conf.} &= \frac{80}{84} \\ &= 0.95 \end{aligned}$$

Lift ≥ 1
 2, 3,

1. Apriori Algorithm

1. Create 1-item itemsets.
2. Find frequent 1-item itemsets based on Min-support.
3. Create 2-item itemsets from 'Frequent' 1-item itemset.
4. Find frequent 2-item itemsets.
5. Find 3-item itemsets from 'Frequent' 2-item itemsets.
6. Find frequent 3-item itemsets.
⋮
7. Find the confidence for rules created above.
8. Find the lift for those rules.