

## 2015 repeat Data Mining

### QUESTION 1

[Total marks: 40]

#### Association Rule Mining

1(a)

[8 Marks]

A survey asked university students to list their hobbies from the following set: Cinema (cin), Music listening (mus), Piano (pia), Guitar (gui), photography (pho), theatre (the), books (boo), football (foo), athletics (ath), and chess (che).  
For data mining purposes, assume the itemset  $I$  to be {ath, boo, che, cin, foo, gui, mus, pho, pia, the}; the number of items  $m = 10$ ; and the number of students in our sample (transactions)  $n = 9$ .

Txn	Itemsets
1	{ath, boo, cin}
2	{cin, mus, gui, the}
3	{cin, mus, pho, the}
4	{che, cin, pho, pia}
5	{ath, cin, foo, mus, the}
6	{foo, gui, mus}
7	{che, cin, foo, mus}
8	{cin, foo, mus}
9	{cin, foo, mus, pia, the}

i. What is the support for {cin, mus}?

Explain your answer through the equation you use to calculate support.

ii. What is meant by the rule {cin,mus}  $\rightarrow$  {foo}?

iii. What is the support for the same rule?

Again, explain the equation used to calculate this support.

iv. What is the difference between *support* and *confidence*?

What is the confidence for this rule?

a)

i)

support for an itemset is the proportion of transactions that contain all the items in  $S$  defined as:

$$\text{Support}(S) = \text{Count}(S)/n$$

Where  $\text{Count}(S)$  = number of transactions matching  $S$

$$\text{Support}(\{cin, mus\}) = \text{Count}(\{cin, mus\})/n = 6/9 = 0.66$$

ii)

the rule {cin,mus}  $\rightarrow$  {foo} means that when cin and mus are chosen we can predict foo will also be chosen.

lii)

Support for a rule  $L \rightarrow R$  is the proportion of transactions in which the items in both  $L$  and  $R$  occur together defined as:

$$\text{Support}(L \rightarrow R) = \text{Count}(L \cup R)/n$$

$$\text{Support}(\{cin, mus\} \rightarrow \{foo\}) = \text{Count}(\{cin, mus\} \cup \{foo\})/n = 4/9 = 0.44$$

iv)

Support applies to all transactions in the database, whereas confidence is the proportion of transactions for which the rule is satisfied and is defined as:

$$\text{Confidence}(S \rightarrow R) = \text{Count}(L \cup R) / \text{Count}(L)$$

$$\text{Confidence}(\{cin, mus\} \rightarrow \{foo\}) = \text{Count}(\{cin, mus, foo\}) / \text{Count}(\{cin, mus\}) = 4/6 = 0.66$$

1(b)

[12 Marks]

Assume we have a database with 5000 transactions and a rule  $L \rightarrow R$  with the following support counts:

$\text{count}(L) = 3400$

$\text{count}(R) = 4000$

$\text{count}(L \cup R) = 3000$

- i. What does the lift function tell us about a rule?
- ii. Calculate support for  $L \rightarrow R$
- iii. Calculate confidence for  $L \rightarrow R$
- iv. Calculate lift for  $L \rightarrow R$
- v. Calculate leverage for  $L \rightarrow R$

b)

i)

The lift function tells us how interesting a rule may be:

$$\text{lift}(L \rightarrow R) = \frac{\text{Count}(L \cup R)}{\text{Count}(L) \times \text{Support}(R)}$$

ii)

$$\text{Support}(L \rightarrow R) = 3000/5000 = 0.6$$

iii)

$$\text{Confidence}(L \rightarrow R) = 3000/3400 = 0.88$$

iv)

$$\text{Lift}(L \rightarrow R) = \frac{3000}{3400 \times (4000/5000)} = 1.10$$

v)

$$\begin{aligned} \text{Leverage}(L \rightarrow R) &= \text{Support}(L \cup R) - \text{support}(L) \times \text{support}(R) \\ &= 0.6 - (3400/5000) \times (4000/5000) = 0.056 \end{aligned}$$

1(c)

[20 Marks]

Suppose that  $L_3$  is the list

{a, b, c}, {a, b, d}, {a, c, d}, {b, c, d}, {b, c, w}, {b, c, x}, {p, q, r}, {p, q, s},  
 {p, q, t}, {p, r, s}, {q, r, s}

Which itemsets are placed in  $C_4$  by the *join* step of the Apriori-gen algorithm?Which are then removed by the *prune* step?

c)

Join Step

 $k = 4, k-2 = 2$ 

First itemset	Second itemset	Contribution to C
{a,b,c}	{a,b,d}	{a,b,c,d}
{b,c,d}	{b,c,w}	{b,c,d,w}
{b,c,d}	{b,c,x}	{b,c,d,x}
{p,q,r}	{p,q,s}	{p,q,r,s}
{p,q,r}	{p,q,t}	{p,q,r,t}

 $C_4 = \{\{a,b,c,d\}, \{b,c,d,w\}, \{b,c,d,x\}, \{p,q,r,s\}, \{p,q,r,t\}\}$ 

Prune Step

ItemsSet in $C_4$	subsets	Subsets all in $L_3$
{a,b,c,d}	{a,b,c}, {a,c,d}, {a,b,d}, {b,c,d}	YES
{b,c,d,w}	{b,c,d}, {b,d,w}, {b,c,w}, {c,d,w}	NO
{b,c,d,x}	{b,c,d}, {b,c,x}, {b,d,x}, {c,d,x}	NO
{p,q,r,s}	{p,q,r}, {p,r,s}, {p,q,s}, {q,r,s}	YES
{p,q,r,t}	{p,q,r}, {p,r,t}	NO

 $C_4 = \{\{a,b,c,d\}, \{p,q,r,s\}\}$

### Classification

The table provided below shows the degrees dataset where classifications are made using different grades achieved for 5 different subjects: Software Engineering (Soft-Eng), Programming (Prog), Human-Computer Interaction (HCI), Data Mining (D.M.) and the Project.

SoftEng	Prog	HCI	D.M.	Project	Class
A	B	A	B	B	SECOND
A	B	B	B	A	FIRST
A	A	A	B	B	SECOND
B	A	A	B	B	SECOND
A	A	B	B	A	FIRST
B	A	A	B	B	SECOND
A	B	B	B	B	SECOND
A	B	B	B	B	SECOND
A	A	A	A	A	FIRST
B	A	A	B	B	SECOND
B	A	A	B	B	SECOND
A	B	B	A	B	SECOND
B	B	B	B	A	SECOND
A	A	B	A	B	FIRST
B	B	B	B	A	SECOND
A	A	B	B	B	SECOND
B	B	B	B	B	SECOND
A	A	B	A	A	FIRST
B	B	B	A	A	SECOND
B	B	A	A	B	SECOND
B	B	B	B	A	SECOND
B	A	B	A	B	SECOND
A	B	B	B	A	FIRST
A	B	A	B	B	SECOND
B	A	B	B	B	SECOND
A	B	B	B	B	SECOND

2(a)

[8 Marks]

Create a decision tree for the degrees dataset using the TDIDT algorithm.

Same as 2014 Q4 a