

COMP4433 Data Mining and Data Warehousing

FAQ on Association Rule Mining II (with suggested answers)

1. Given the following transactional database for sequential association analysis. Let $min_sup=25\%$ and $min_conf=50\%$.

Customer	Transaction Time	Items
David	2 Feb 2002	30,50
David	10 Feb 2002	50
David	21 Feb 2002	70
John	5 Feb 2002	10,30
John	7 Feb 2002	50
John	16 Feb 2002	40,60,70
John	27 Feb 2002	50,90
Peter	16 Feb 2002	30,50,70
Aaron	5 Feb 2002	30
Aaron	7 Feb 2002	30, 50
Aaron	17 Feb 2002	70
Aaron	27 Feb 2002	50
Leon	13 Feb 2002	30

Modify the AprioriAll-based sequential pattern mining algorithm so that it allows reoccurrence of itemsets in frequent sequences, e.g., a customer bought itemset A and then itemset B will buy itemset A again in the future.

- (a) Find all frequent sequences using your modified algorithm.
- (b) Random pick one frequent 4-sequence, if there exists one, and generate the corresponding strong sequential association rule(s).

(a) Answer

Sort Phase:

Customer ID	Customer Sequence
David	<(30 50),(50),(70)>
John	<(10 30),(50),(40 60 70),(50 90)>
Peter	<(30 50 70)>
Aaron	<(30),(30 50),(70),(50)>
Leon	<(30)>

Litemset Phase: $min_sup = 25\%$ (i.e. ≥ 2 customers)

Freq. Itemsets	Mapped to
(30)	1
(50)	2
(70)	3
(30 50)	4

Transformation Phase

Customer ID	Customer Sequence	Transformed Sequence	Mapping
David	$\langle (30\ 50), (50), (70) \rangle$	$\langle \{(30), (50), (30\ 50)\}, \{(50)\}, \{(70)\} \rangle$	$\langle \{1,2,4\} \{2\} \{3\} \rangle$
John	$\langle (10\ 30), (50), (40\ 60\ 70), (50\ 90) \rangle$	$\langle \{(30)\}, \{(50)\}, \{(70)\}, \{(50)\} \rangle$	$\langle \{1\} \{2\} \{3\} \{2\} \rangle$
Peter	$\langle (30\ 50\ 70) \rangle$	$\langle \{(30)\ (50)\ (70)\ (30\ 50)\} \rangle$	$\langle \{1,2,3,4\} \rangle$
Aaron	$\langle (30), (30\ 50), (70), (50) \rangle$	$\langle \{(30)\}, \{(30), (50), (30\ 50)\}, \{(70)\}, \{(50)\} \rangle$	$\langle \{1\} \{1,2,4\} \{3\} \{2\} \rangle$
Leon	$\langle (30) \rangle$	$\langle (30) \rangle$	$\langle \{1\} \rangle$

Sequence Phase:

1-sequence	Count	2-sequence	Count	3-sequence	Count	4-sequence	Count
$\langle 1 \rangle$	5	$\langle 1 1 \rangle$	1	$\langle 1\ 2\ 3 \rangle$	3	$\langle 1\ 2\ 3\ 2 \rangle$	2
$\langle 2 \rangle$	4	$\langle 1\ 2 \rangle$	3	$\langle 1\ 3\ 2 \rangle$	2	$\langle 1\ 2\ 2\ 3 \rangle$	0
$\langle 3 \rangle$	4	$\langle 2\ 1 \rangle$	0	$\langle 1\ 2\ 2 \rangle$	2	$\langle 1\ 2\ 3\ 3 \rangle$	0
$\langle 4 \rangle$	3	$\langle 1\ 3 \rangle$	3	$\langle 1\ 3\ 3 \rangle$	0	$\langle 1\ 3\ 2\ 2 \rangle$	0
		$\langle 3\ 1 \rangle$	0	$\langle 2\ 2\ 2 \rangle$	0	$\langle 1\ 2\ 2\ 2 \rangle$	0
		$\langle 1\ 4 \rangle$	1	$\langle 2\ 2\ 3 \rangle$	1	$\langle 2\ 3\ 2\ 2 \rangle$	0
		$\langle 4\ 1 \rangle$	0	$\langle 2\ 3\ 2 \rangle$	2		
		$\langle 2\ 2 \rangle$	3	$\langle 2\ 3\ 3 \rangle$	0		
		$\langle 2\ 3 \rangle$	3	$\langle 3\ 2\ 2 \rangle$	0		
		$\langle 3\ 2 \rangle$	2	$\langle 4\ 2\ 2 \rangle$	0		
		$\langle 2\ 4 \rangle$	0	$\langle 4\ 2\ 3 \rangle$	1		
		$\langle 4\ 2 \rangle$	2	$\langle 4\ 3\ 2 \rangle$	1		
		$\langle 3\ 3 \rangle$	0	$\langle 4\ 3\ 3 \rangle$	0		
		$\langle 3\ 4 \rangle$	0				
		$\langle 4\ 3 \rangle$	2				
		$\langle 4\ 4 \rangle$	0				

(b) Answer

Rule	Support	Confidence	Strong or not?
$1 \rightarrow 2\ 3\ 2$	2 (40%)	2/5 (40%)	No
$1\ 2 \rightarrow 3\ 2$	2 (40%)	2/3 (~66.7%)	Yes
$1\ 2\ 3 \rightarrow 2$	2 (40%)	2/3 (~66.7%)	Yes