

High Utility Itemsets (HUI)

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Utility of Itemsets, High Utility Itemsets

Example Transaction Dataset D with utilities

Id	Transaction
T_1	a(1) c(10) d(1)
T_2	a(2) c(6)
T_3	a(2) b(2) d(6)
T_4	b(4) c(13) d(3)
T_5	b(2) c(4)
T_6	a(1) b(1) c(1) d(1)

• Utility of itemset X is the sum of utilities of X's items in transactions containing X.

• $ut(\{abcd\}) = 4$, $ut(\{cd\}) = 29$, $ut(\{d\}) = 11$.

• X is called a *high utility itemset (HUI)* if its utility $ut(X) > \text{threshold } \text{minUtil}$.

• Let $\text{minUtil} = 28$:

- $\{cd\}$ is a high utility itemset
- $\{d\}$ and $\{abcd\}$ are not high utility itemsets.

• **Property.** There is no guarantee that the utility of itemset X is greater than or equal to the utility of its proper superset. ²

Transaction Utility of Itemset

Example Transaction Dataset D with utilities

Id	Transaction	Utility of transaction
T_1	a(1) c(10) d(1)	12
T_2	a(2) c(6)	8
T_3	a(2) b(2) d(6)	10
T_4	b(4) c(13) d(3)	20
T_5	b(2) c(4)	6
T_6	a(1) b(1) c(1) d(1)	4

• Utility of a transaction is the sum of utilities of all items in this transaction.

• Transaction utility of itemset X is the sum of utilities of transactions containing X.

• $ut(\{abcd\}) = 4$, $ut(\{cd\}) = 29$, $ut(\{d\}) = 11$.

• $tut(\{abcd\}) = 4$, $tut(\{cd\}) = 36$, $tut(\{d\}) = 46$.

• **Property.**

- $tut(X) \geq ut(X)$.
- The transaction utility of itemset X is greater than or equal to the transaction utility of its proper superset.

Two-Phase Algorithm: Phase I

Example Transaction Dataset D with utilities

Id	Transaction	Utility of transaction
T_1	a(1) c(10) d(1)	12
T_2	a(2) c(6)	8
T_3	a(2) b(2) d(6)	10
T_4	b(4) c(13) d(3)	20
T_5	b(2) c(4)	6
T_6	a(1) b(1) c(1) d(1)	4

• $\text{minUtil} = 28$.

Candidates (with transaction utilities):

• $C_1 \rightarrow \text{Promising } C_1: a(34) b(40) c(50) d(46)$

• $C_2 \rightarrow \text{Promising } C_2: ab(14) ac(24) ad(26) bc(30) bd(34) cd(36)$

• $C_3 \rightarrow \text{Promising } C_3: bcd(24)$

Two-Phase Algorithm: Phase II

• $\text{minUtil} = 28$.

Example Transaction Dataset D with utilities

Id	Transaction	Utility of transaction
T_1	a(1) c(10) d(1)	12
T_2	a(2) c(6)	8
T_3	a(2) b(2) d(6)	10
T_4	b(4) c(13) d(3)	20
T_5	b(2) c(4)	6
T_6	a(1) b(1) c(1) d(1)	4

Result of phase I (with transaction utilities):

• Promising $C_1: a(34) b(40) c(50) d(46)$

• Promising $C_2: bc(30) bd(34) cd(36)$

Phase II (with utilities):

• Promising $C_1 \rightarrow \text{HUI}_1: a(6) b(9) c(34) d(11)$

• Promising $C_2 \rightarrow \text{HUI}_2: bc(25) bd(17) cd(29)$ ⁵

References

- Ying Liu, Wei-keng Liao, Alok Choudhary: A Two-Phase Algorithm for Fast Discovery of High Utility Itemsets. PAKDD 2005: 689-695

- <http://www.philippe-fournier-viger.com/spmf/>