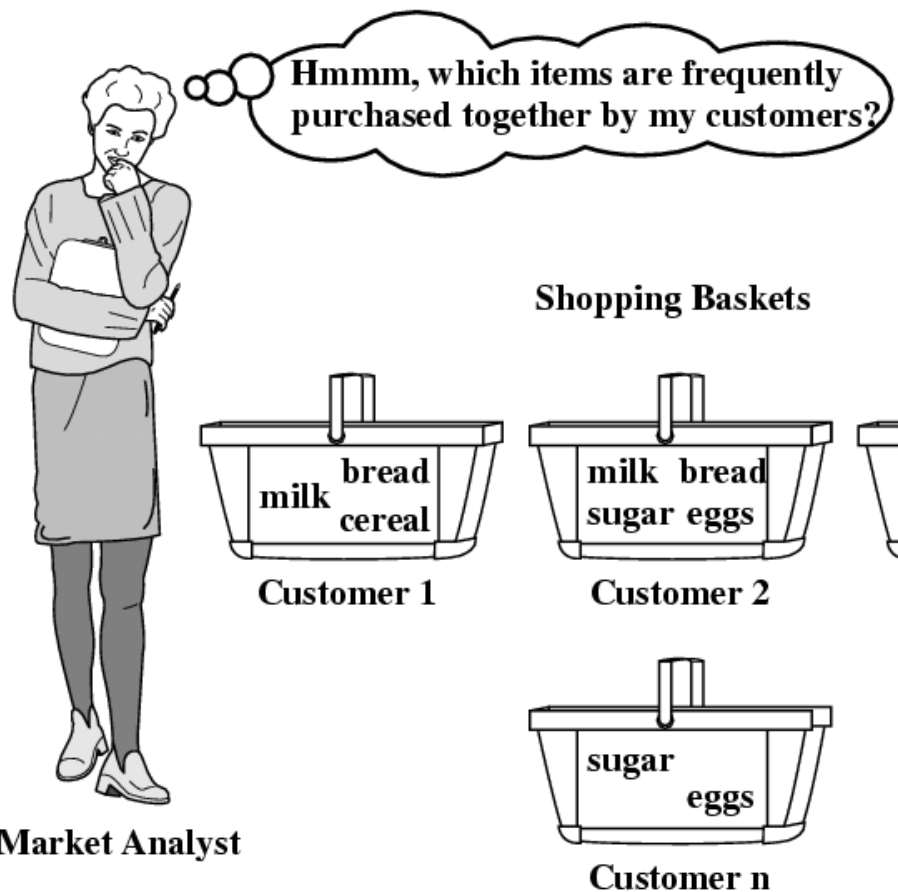


# 關聯規則探勘(購物籃分析)



TID	Transaction
$T_1$	{Milk, Bread, Cereal}
$T_2$	{Milk, Bread, Sugar, Eggs}
$T_3$	{Milk, Bread, Butter}
$T_4$	{Sugar, Eggs}

Milk  $\Rightarrow$  Bread [75%, 100%]

# Motivation

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## □ Purpose of Association Rule Mining

- Finding associations, correlations, or causal structures among item sets in databases

## □ Application

- Market Basket Analysis

## □ Example

- {啤酒} → {尿布}

# Related Definitions about Association Rule Mining

## □ Item

- e.g., A, B, C, D, E, F

## □ Itemset

- e.g., {ABC}

## □ Contain

- e.g., {AB} is contained in {ABC}

## □ Superset

- e.g., {ABC} is a superset of {AB}

## □ Subset

- e.g., {AB} is a subset of {ABC}
- e.g., The complete set of the subsets of {ABC} is  
 $\{\{A\}, \{B\}, \{C\}, \{AB\}, \{AC\}, \{BC\}, \{ABC\}\}$

Transaction Database	
TID	Transaction
1	ABC
2	AC
3	AD
4	BEF

# Related Definitions about Association Rule Mining

## □ Tidset of an itemset

- $Tidset(\{AC\}) = \{1, 2\}$

## □ Support count of an itemset

- e.g.,  $SC(\{AC\}) = |Tidset(\{AC\})| = 2$

## □ Support of an itemset

- e.g.,  $SP(\{AC\}) = 2/4 = 50\%$

## □ Frequent itemset

- An itemset  $X$  is called *frequent itemset* iff  $SP(X)$  is no less than a user-specified minimum support threshold  $\delta$  ( $0\% \leq \delta \leq 100\%$ ).
- e.g., if  $\delta = 50\%$ ,  $\{AC\}$  is a frequent itemset but  $\{ABC\}$  is not

Transaction Database	
TID	Transaction
1	ABC
2	AC
3	AD
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# Related Definitions about Association Rule Mining

## □ Rule

■  $R: X \rightarrow Y$

□  $X$  and  $Y$  are frequent itemset

□  $X \cap Y = \emptyset$

□  $X$  is called *antecedent* (Left hand side; LHS)

□  $Y$  is called *consequent* (Right hand side; RHS)

■ e.g.,  $\{A\} \rightarrow \{C\}$

Transaction Database	
TID	Transaction
1	ABC
2	AC
3	AD
4	BEF

## □ Support of a rule

■  $SP(R) = SP(X \cup Y)$

■ e.g.,  $SP(\{A\} \rightarrow \{C\}) = SP(\{A\} \cup \{C\}) = 2/4$

# Related Definitions about Association Rule Mining

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## □ Confidence of a rule

- $CF(R) = SP(X \cup Y) / SP(X)$

- e.g.,  $CF(\{A\} \rightarrow \{C\}) =$   
 $SP(\{A\} \cup \{C\}) / SP(\{A\}) = (2/4) / (3/4) = 2/3$

- $CF(R) = SC(X \cup Y) / SC(X)$

- e.g.,  $CF(\{A\} \rightarrow \{C\}) = SC(\{AC\}) / SC(\{A\}) = 2/3$

Transaction Database	
TID	Transaction
1	ABC
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# Related Definitions about Association Rule Mining

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## □ Association Rule

- A rule  $R$  is called *association rule* iff its support and confidence are no less than user-specified minimum support  $min\_sup$  and minimum confidence  $min\_conf$  thresholds, respectively.

# Two Main Steps in Association Rule Mining

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- Association rule mining consists of two main steps:
  - Frequent itemset mining
  - Rule generation



# The Apriori Algorithm - An Example

$min\_sc = 2$

Tid	Items
10	ACD
20	BCE
30	ABCE
40	BE

1<sup>st</sup> scan

$C_1$

Itemset	sup
{A}	2
{B}	3
{C}	3
{D}	1
{E}	3

$L_1$

Itemset	sup
{A}	2
{B}	3
{C}	3
{E}	3

$L_2$

Itemset	sup
{A, C}	2
{B, C}	2
{B, E}	3
{C, E}	2

$C_2$

Itemset	sup
{A, B}	1
{A, C}	2
{A, E}	1
{B, C}	2
{B, E}	3
{C, E}	2

2<sup>nd</sup> scan

$C_2$

Itemset
{A, B}
{A, C}
{A, E}
{B, C}
{B, E}
{C, E}

$C_3$

Itemset
{B, C, E}

3<sup>rd</sup> scan

$L_3$

Itemset	sup
{B, C, E}	2

# Downward Closure Property

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## □ Downward Closure Property

- Any superset of an infrequent itemset are infrequent
- Any subset of a frequent itemset are frequent

Transaction Database	
TID	Transaction
1	ABC
2	AC
3	AD
4	BEF

# Rule Generation

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- If {ABC} is frequent
  - $A \rightarrow BC$        $\frac{\text{sup count}(ABC)}{\text{sup count}(A)}$
  - $\frac{\text{sup}(ABC)}{\text{sup}(A)}$