

# Introduction to Association Rules



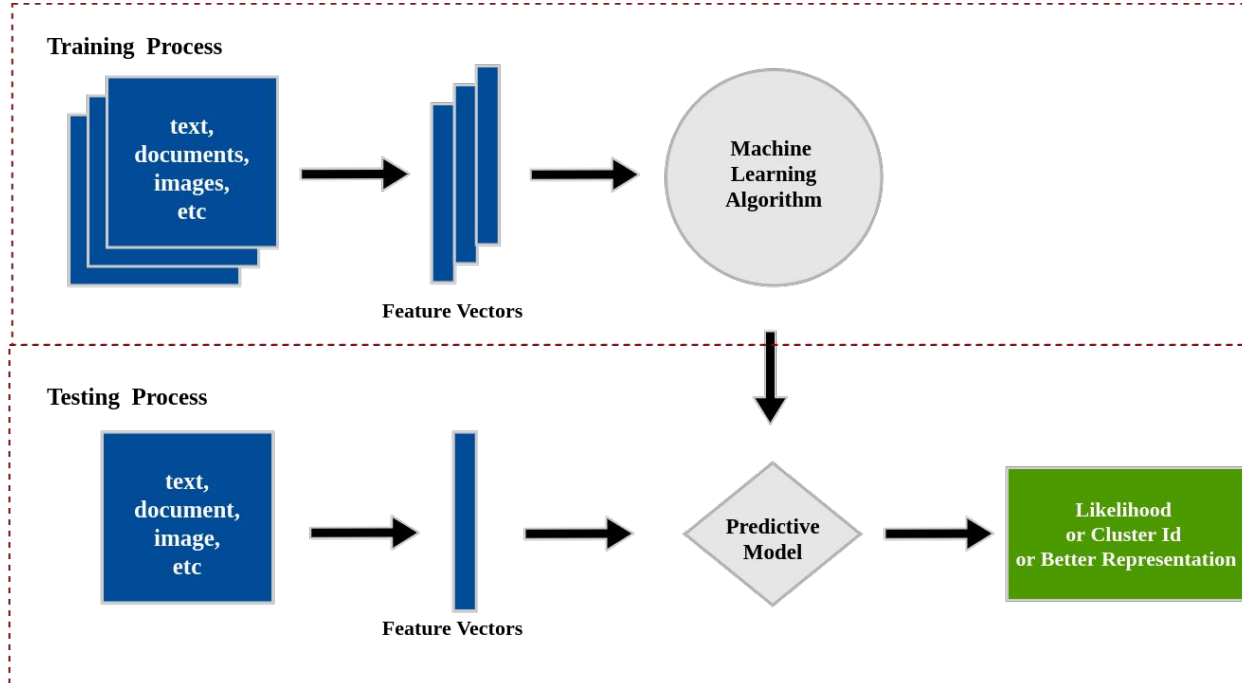
# APA YANG AKAN KITA PELAJARI



## Associations and applications

- What is Association Rules
- Association Rules Intuition
- Association Rules Algorithm
- Applications of Association
- Association Rules Cases

# Unsupervised Learning Process



# **Apa itu Association Rules Mengapa Kita Pelajari di Data Science?**





**Association Rules Learning: The**  
**unsupervised learning technique** that  
checks for the dependency of one data  
item on another **data item** and **maps**  
**accordingly** so that it can be more

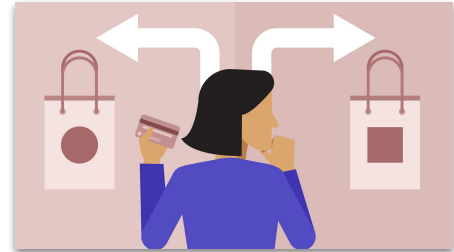
# Association Rules Use Cases



Market Basket Analysis



Recommendation  
Systems



Customer Behavior

# Market Basket Transaction

Purchase ID	Items
1	Bread, Milk
2	Bread, Diaper, Beer, Snacks
3	Milk, Diaper, Beer, Soda
4	Bread, Milk, Diaper, Beer
5	Bread, Milk, Diaper, Soda

## Association Rules:

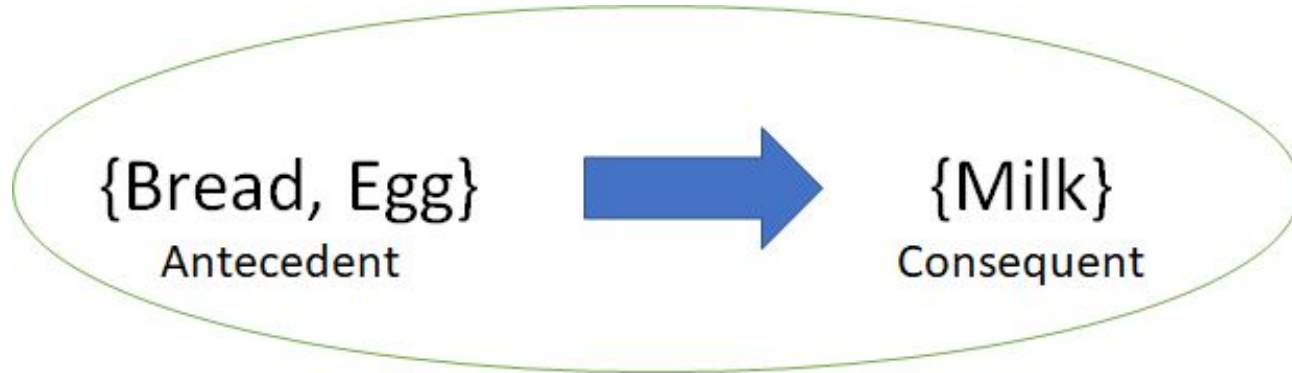
{Bread} -> {Snacks}

{Bread, Beer} -> {Snacks}

{Bread, Milk} -> {Diaper, Soda}

{Milk, Bread} -> {Soda, Beer}

# Itemset



Itemset = {Bread, Egg, Milk}



# Association Rules Evaluation



## Metrics for Evaluation:

1. Support
2. Confidence

# Support



The relative frequency that the rules show up

$$\text{Support}(\{X\} \rightarrow \{Y\}) = \frac{\text{Transactions containing both } X \text{ and } Y}{\text{Total number of transactions}}$$

{Bread, Diaper} => Beer

S({Bread, Diaper, Beer}) = 2/5

Support Count = 2

Purchase ID	Items
1	Bread, Milk
2	Bread, Diaper, Beer, Snacks
3	Milk, Diaper, Beer, Soda
4	Bread, Milk, Diaper, Beer
5	Bread, Milk, Diaper, Soda

## Measure of the reliability of a rule by likeliness of occurrence of consequent



$$\text{Confidence}(\{X\} \rightarrow \{Y\}) = \frac{\text{Transactions containing both } X \text{ and } Y}{\text{Transactions containing } X}$$

{Bread, Diaper} => Beer

$$C(\{\text{Bread, Diaper, Beer}\}) = 2/3$$

Purchase ID	Items
1	Bread, Milk
2	Bread, Diaper, Beer, Snacks
3	Milk, Diaper, Beer, Soda
4	Bread, Milk, Diaper, Beer
5	Bread, Milk, Diaper, Soda

# Association Rules Mining



**From given the dataset, find the rules that:**

1. Support  $\geq$  min support threshold
2. Confidence  $\geq$  min confidence threshold

# Mining Association Rules



- 1. Frequent Itemset Generation**
  - Generate all itemsets whose support  $\geq$  min support
- 1. Rule Generation**
  - Generate high confidence rules from each frequent itemset

# Association Rules Algorithm



1. Apriori
2. Eclat

# Apriori Steps



1. Set minimum Support and Confidence threshold  
Repeat until there are no new frequent itemsets:
1. Takes all subset in the loop in the transactions which have bigger Support than minimum Confidence
2. Take all the rules of these subsets which have bigger confidence than minimum confidence
3. Sort the rules by decreasing lift

$$\text{Lift} = (\text{Confidence}(X \rightarrow Y) / \text{Support}(Y))$$