

## Questions

Given the following transaction record

Transaction Records	
Transaction ID	Items
#1	apple, banana, coca-cola, doughnut
#2	banana, coco-cola
#3	banana, doughnut
#4	apple, coca-cola
#5	apple, banana, doughnut
#6	apple, banana, coca-cola

1. Build the **FP-tree** using a minimum support ***min\_sup*** = 2. Show how the tree evolves for each transaction.
2. With the previous transaction record, Use the **Apriori algorithm** on this dataset and verify that it will generate the same set of frequent itemsets with ***min\_sup*** = 2.
3. Suppose that { **Apple, Banana, Doughnut** } is a frequent item set, **derive all its association rules** with ***min\_confidence*** = 70%

## Solutions:

1.

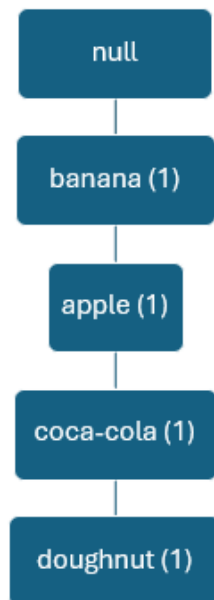
1. Calculate the frequency of each item across all transactions:

banana: 5  
apple: 4  
coca-cola: 4  
doughnut: 3

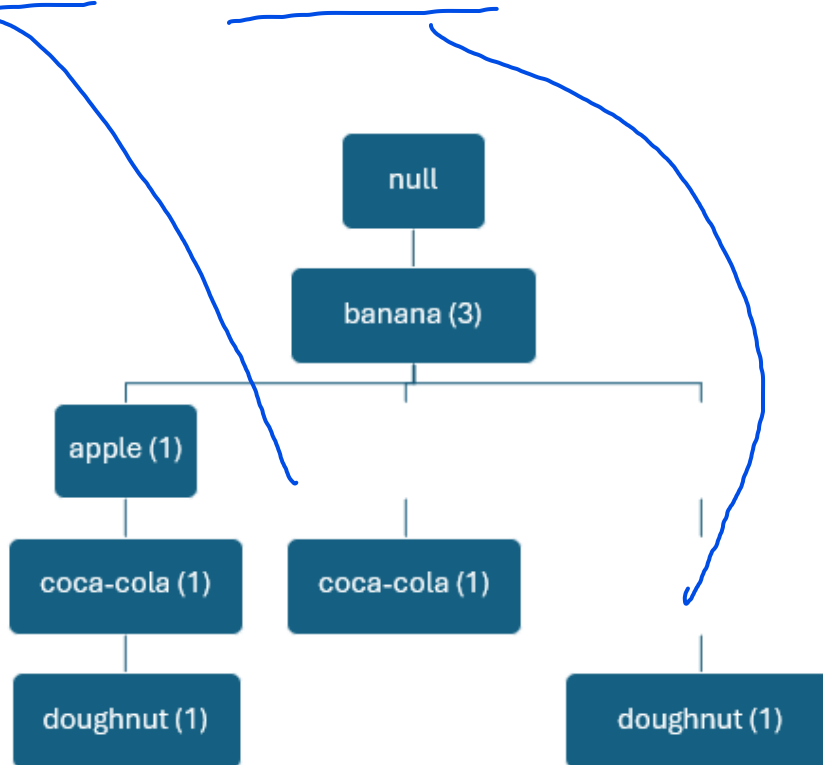
2. Sort the items in each transaction based on frequency:

Transaction 1: banana, apple, coca-cola, doughnut  
Transaction 2: banana, coca-cola  
Transaction 3: banana, doughnut  
Transaction 4: apple, coca-cola  
Transaction 5: banana, apple, doughnut  
Transaction 6: banana, apple, coca-cola

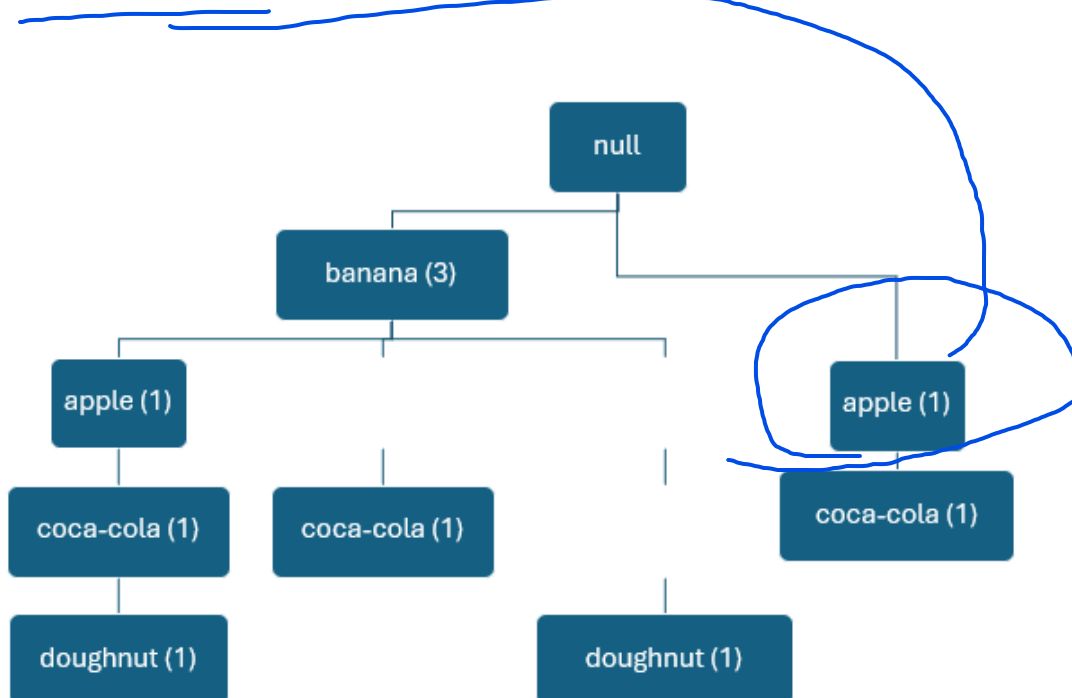
3. Adding Transaction 1:



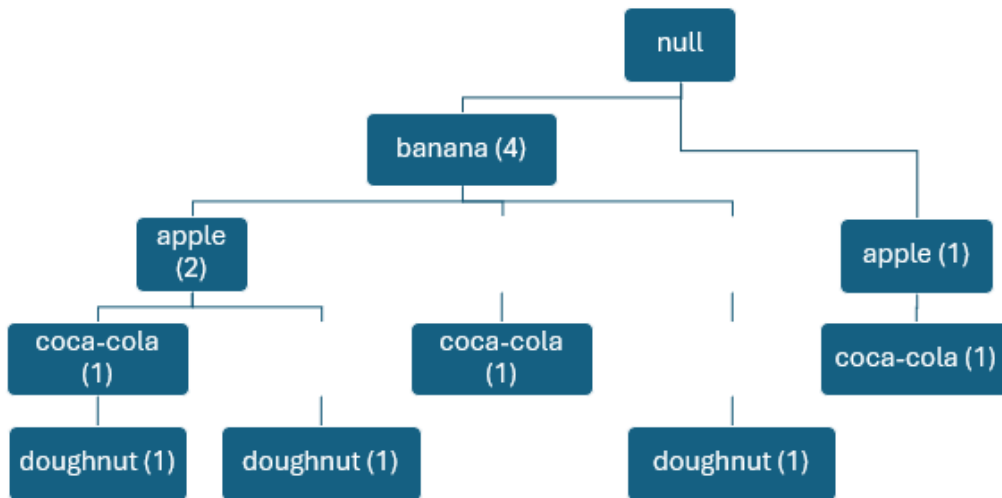
Adding Transaction 2 and then Adding Transaction 3:



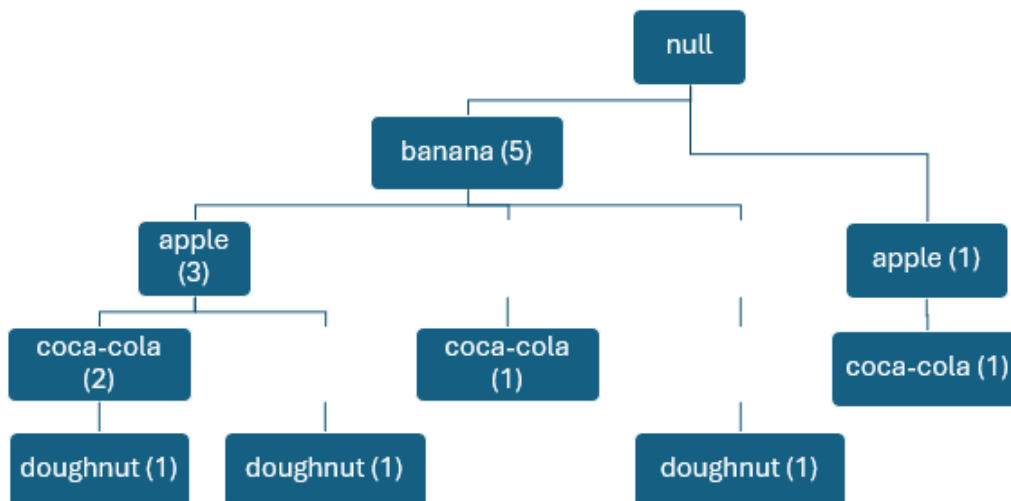
Adding Transaction 4:



Adding Transaction 5:



Adding Transaction 6:



## 2.

We'll apply the Apriori algorithm with a minimum support ( $\text{min\_sup} = 2$ ) to find the frequent itemsets.

### 1. Generate Frequent 1-Itemsets:

{banana}: 5  
{apple}: 4  
{coca-cola}: 4  
{doughnut}: 3

### 2. Generate Frequent 2-Itemsets:

{banana, apple}: 3  
{banana, coca-cola}: 2  
{banana, doughnut}: 2  
{apple, coca-cola}: 3  
{apple, doughnut}: 2

### 3. Generate Frequent 3-Itemsets:

{banana, apple, coca-cola}: 2  
{banana, apple, doughnut}: 2

### 4. Generate Frequent 4-Itemsets:

There are no 4-itemsets that meet the minimum support threshold.

### 5. Frequent Itemsets using Apriori:

{banana}: 5  
{apple}: 4  
{coca-cola}: 4  
{doughnut}: 3  
{banana, apple}: 3  
{banana, coca-cola}: 2  
{banana, doughnut}: 2  
{apple, coca-cola}: 3  
{apple, doughnut}: 2  
{banana, apple, coca-cola}: 2  
{banana, apple, doughnut}: 2

## 3.

For the frequent itemset {apple, banana, doughnut}, the possible association rules are:

{apple} → {banana, doughnut}  
{banana} → {apple, doughnut}  
{doughnut} → {apple, banana}  
{apple, banana} → {doughnut}

{apple, doughnut} → {banana}  
{banana, doughnut} → {apple}

Now, we calculate the confidence for each rule:

$$\text{confidence}(\{\text{apple}\} \rightarrow \{\text{banana}, \text{doughnut}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{apple}\}} = \frac{2}{4} = 0.50$$

$$\text{confidence}(\{\text{banana}\} \rightarrow \{\text{apple}, \text{doughnut}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{banana}\}} = \frac{2}{5} = 0.40$$

$$\text{confidence}(\{\text{doughnut}\} \rightarrow \{\text{apple}, \text{banana}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{doughnut}\}} = \frac{2}{3} \approx 0.67$$

$$\text{confidence}(\{\text{apple}, \text{banana}\} \rightarrow \{\text{doughnut}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{apple}, \text{banana}\}} = \frac{2}{3} \approx 0.67$$

$$\text{confidence}(\{\text{apple}, \text{doughnut}\} \rightarrow \{\text{banana}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{apple}, \text{doughnut}\}} = \frac{2}{2} = 1$$

$$\text{confidence}(\{\text{banana}, \text{doughnut}\} \rightarrow \{\text{apple}\}) = \frac{\{\text{apple}, \text{banana}, \text{doughnut}\}}{\{\text{banana}, \text{doughnut}\}} = \frac{2}{2} = 1$$

Only the following rules meet the minimum confidence threshold of 70%:

{apple, doughnut} → {banana} with 100% confidence.

{banana, doughnut} → {apple} with 100% confidence.