

Quiz 3

- There are 6 problems total worth 35 points as shown in each question.
- You must not communicate with other students during this test.
- No books, notes allowed.
- No other electronic device except calculators are allowed. You cannot use your mobile as calculators.
- This is a 45 minute exam.
- Do not turn this page until instructed to.
- There are several different versions of this exam.

1. Fill in your information:

Full Name: _____

NetID: _____

1/1. (5 points) Suppose we use Bottom-Up Computation (BUC) to materialize cubes. We have a 3-D data array containing three dimensions A, B, C. The data contained in the array is as follows:

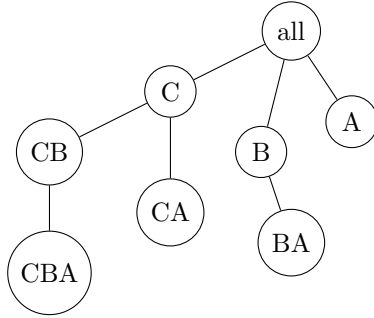
$(a_0; b_0; c_0) : 1$	$(a_0; b_0; c_1) : 1$	$(a_0; b_0; c_2) : 1$
$(a_0; b_1; c_0) : 1$	$(a_0; b_1; c_1) : 1$	$(a_0; b_1; c_2) : 1$
$(a_0; b_2; c_0) : 1$	$(a_0; b_2; c_1) : 1$	$(a_0; b_2; c_2) : 1$
$(a_0; b_3; c_0) : 1$	$(a_0; b_3; c_1) : 1$	$(a_0; b_3; c_2) : 1$

Now suppose we construct an iceberg cube for dimension A, B, C with different orders of exploration.

- A. Draw the trace trees of expansion with regard to exploration order: C, B, A.
- B. Suppose the minimum support = 4 with the exploration order of A, B, C, how many cells would be computed? Please give detailed explanation.

Solution.

A. 2 marks



- B. 16 Cubes to be computed, *All, a₀, a₀b₀, a₀b₁, a₀b₂, a₀b₃, a₀c₀, a₀c₁, a₀c₂, b₀, b₁, b₂, b₃, c₀, c₁, c₂* - 3 marks (Partial marks for partial answer)

1/2. (5 points) Suppose we use Bottom-Up Computation (BUC) to materialize cubes. We have a 3-D data array containing three dimensions A, B, C. The data contained in the array is as follows:

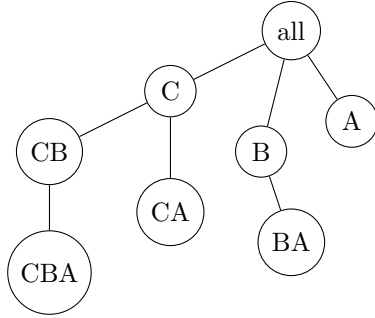
$(a_0; b_0; c_0) : 1$	$(a_0; b_0; c_1) : 1$	$(a_0; b_0; c_2) : 1$
$(a_0; b_1; c_0) : 2$	$(a_0; b_1; c_1) : 2$	$(a_0; b_1; c_2) : 2$
$(a_0; b_2; c_0) : 1$	$(a_0; b_2; c_1) : 1$	$(a_0; b_2; c_2) : 1$
$(a_0; b_3; c_0) : 1$	$(a_0; b_3; c_1) : 1$	$(a_0; b_3; c_2) : 1$

Now suppose we construct an iceberg cube for dimension A, B, C with different orders of exploration.

- A. Draw the trace trees of expansion with regard to exploration order: C, B, A.
- B. Suppose the minimum support = 4 with the exploration order of A, B, C, how many cells would be computed? Please give detailed explanation.

Solution.

A. 2 marks



B. 22 Cubes to be computed, -3 marks (Partial marks for partial answer)

1/3. (5 points) Suppose we use Bottom-Up Computation (BUC) to materialize cubes. We have a 3-D data array containing three dimensions A, B, C. The data contained in the array is as follows:

$(a_0; b_0; c_0) : 1$	$(a_0; b_0; c_1) : 1$	$(a_0; b_0; c_2) : 3$
$(a_0; b_1; c_0) : 1$	$(a_0; b_1; c_1) : 1$	$(a_0; b_1; c_2) : 1$
$(a_0; b_2; c_0) : 2$	$(a_0; b_2; c_1) : 1$	$(a_0; b_2; c_2) : 1$
$(a_0; b_3; c_0) : 1$	$(a_0; b_3; c_1) : 2$	$(a_0; b_3; c_2) : 1$

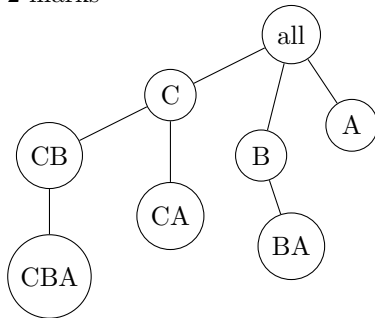
Now suppose we construct an iceberg cube for dimension A, B, C with different orders of exploration.

A. Draw the trace trees of expansion with regard to exploration order: C, B, A.

B. Suppose the minimum support = 4 with the exploration order of A, B, C, how many cells would be computed? Please give detailed explanation.

Solution.

A. 2 marks



B. 31 Cubes to be computed, - 3 marks (Partial marks for partial answer)

2/1. (5 points)

Suppose the standard deviation of n observations x_1, x_2, \dots, x_n as

$$s = \sqrt{\frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})^2}$$

Is this measure a distributive, algebraic or holistic measure? Justify your answer.

Solution. Algebraic - 2 marks

After some calculations, $s = \sqrt{\frac{1}{N} \sum_{i=1}^N (x_i)^2 - \frac{1}{N} (x_i)^2}$. Algebraic since the measure can be computed based on three distributive measures: n , $\sum x_i^2$ and $\sum x_i$ - 3 marks

3/1. (5 points) Given a database of T tuples, D dimensions, and F shell fragment size, the fragment cubes's space requirement is:

$$O(T^{\lceil \frac{D}{F} \rceil} (2^F - 1))$$

Consider two cases, where $F = 1$ and $F = D$,

- A. In what case is the space requirement lowest?
- B. What are challenges in using this value of F ?

Solution.

- A. $F = 1$ $O(TD)$, $F = D$ $O(T(2^D - 1))$, 2 marks Space lowest on $F = 1$ - 1 Mark
 - B. Long query execution time - 2 marks
-

4/1. (5 points) We have a data array containing 3 dimensions A, B and C. The 3-D array is divided into small chunks. Each dimension is divided into 3 equally sized partitions. See Figure 1. For example, dimension A is divided into a_0, a_1 and a_2 , and dimension B is divided into b_0, b_1 and b_2 . There are totally 27 chunks and each chunk is represented by a sub-cube $a_i b_j c_k$. The cardinality (size) of the dimensions A, B, and C is 900, 300, and 600. Since we divide each dimension into 3 parts with equal size, the sizes of the chunks on dimensions A, B, and C are 300, 100, and 200 respectively. Now we want to use **Multiway Array Aggregation** Computation to materialize cubes. The base cuboid ABC is computed as a 3-D array. We want to materialize the 2-D cuboids AB, AC and BC.

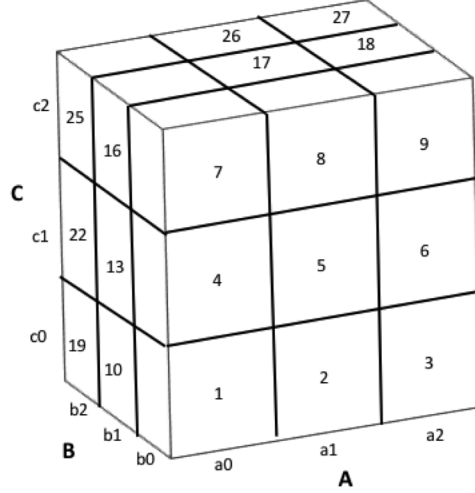


Figure 1: Figure 1: A 3-D array with dimensions A, B and C. This array is divided into 27 smaller chunks.

If we scan the chunk in the order 1, 2, 3, ..., 27 when materializing the 2-D cuboids AB, AC and BC, to avoid reading a 3-D chunk into memory repeatedly, what is the minimum memory requirement to hold all the related 2-D planes?

Solution. 5 marks (Partial marks if almost right)

Space requirement = AC + AB + BC = $900 \times 600 + 100 \times 900 + 100 \times 200 = 650,000$ - 5 marks

4/2. (5 points) We have a data array containing 3 dimensions A, B and C. The 3-D array is divided into small chunks. Each dimension is divided into 3 equally sized partitions. See Figure 1. For example, dimension A is divided into a_0, a_1 and a_2 , and dimension B is divided into b_0, b_1 and b_2 . There are totally 27 chunks and each chunk is represented by a sub-cube $a_i b_j c_k$. The cardinality (size) of the dimensions A, B, and C is 300, 900, and 600. Since we divide each dimension into 3 parts with equal size, the sizes of the chunks on dimensions A, B, and C are 100, 300, and 200 respectively. Now we want to use **Multiway Array Aggregation** Computation to materialize cubes. The base cuboid ABC is computed as a 3-D array. We want to materialize the 2-D cuboids AB, AC and BC.

If we scan the chunk in the order 1, 2, 3, ..., 27 when materializing the 2-D cuboids AB, AC and BC, to avoid reading a 3-D chunk into memory repeatedly, what is the minimum memory requirement to hold all the related 2-D planes?

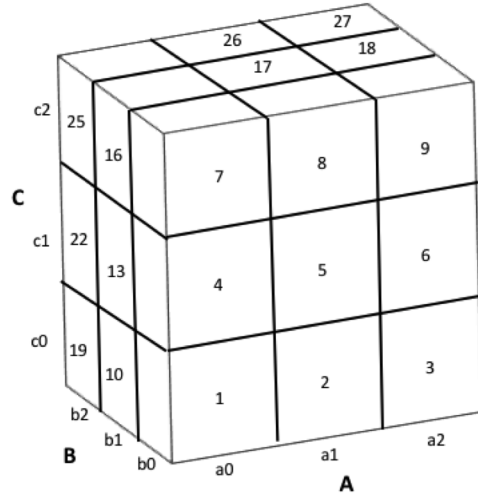


Figure 2: Figure 1: A 3-D array with dimensions A, B and C. This array is divided into 27 smaller chunks.

Solution. 5 marks (Partial marks if almost right)

Space requirement = $AC + AB + BC = 300 \cdot 600 + 300 \cdot 300 + 300 \cdot 200 = 330,000$ - 5 marks

4/3. (5 points) We have a data array containing 3 dimensions A, B and C. The 3-D array is divided into small chunks. Each dimension is divided into 3 equally sized partitions. See Figure 1. For example, dimension A is divided into a_0, a_1 and a_2 , and dimension B is divided into b_0, b_1 and b_2 . There are totally 27 chunks and each chunk is represented by a sub-cube $a_i b_j c_k$. The cardinality (size) of the dimensions A, B, and C is 600, 300, and 900. Since we divide each dimension into 3 parts with equal size, the sizes of the chunks on dimensions A, B, and C are 200, 100, and 300 respectively. Now we want to use **Multiway Array Aggregation** Computation to materialize cubes. The base cuboid ABC is computed as a 3-D array. We want to materialize the 2-D cuboids AB, AC and BC.

If we scan the chunk in the order 1, 2, 3, ..., 27 when materializing the 2-D cuboids AB, AC and BC, to avoid reading a 3-D chunk into memory repeatedly, what is the minimum memory requirement to hold all the related 2-D planes?

Solution. 5 marks (Partial marks if almost right)

Space requirement = $AC + AB + BC = 600 \cdot 900 + 600 \cdot 100 + 100 \cdot 300 = 630,000$ - 5 marks

4/4. (5 points) We have a data array containing 3 dimensions A, B and C. The 3-D array is divided into small chunks. Each dimension is divided into 3 equally sized partitions. See Figure 1. For example, dimension A is divided into a_0, a_1 and a_2 , and dimension B is divided into b_0, b_1 and b_2 . There are totally 27 chunks and each chunk is represented by a sub-cube $a_i b_j c_k$. The cardinality (size) of the dimensions A, B, and C is 300, 600, and 900. Since we divide each dimension into 3

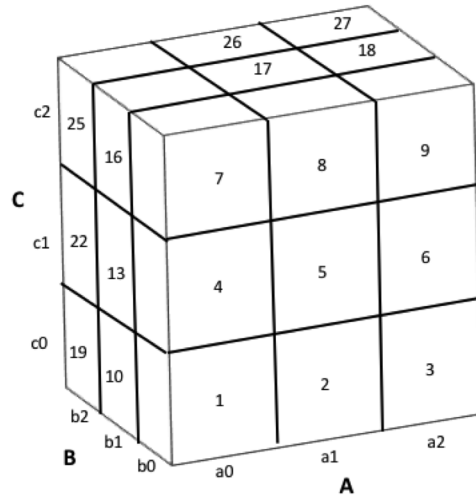


Figure 3: Figure 1: A 3-D array with dimensions A, B and C. This array is divided into 27 smaller chunks.

parts with equal size, the sizes of the chunks on dimensions A, B, and C are 100, 200, and 300 respectively. Now we want to use **Multiway Array Aggregation** Computation to materialize cubes. The base cuboid ABC is computed as a 3-D array. We want to materialize the 2-D cuboids AB, AC and BC.

If we scan the chunk in the order 1, 2, 3, ...27 when materializing the 2-D cuboids AB, AC and BC, to avoid reading a 3-D chunk into memory repeatedly, what is the minimum memory requirement to hold all the related 2-D planes?

Solution. 5 marks (Partial marks if almost right)

Space requirement = AC + AB + BC = $300 \times 900 + 300 \times 200 + 200 \times 300 = 390,000$ - 5 marks

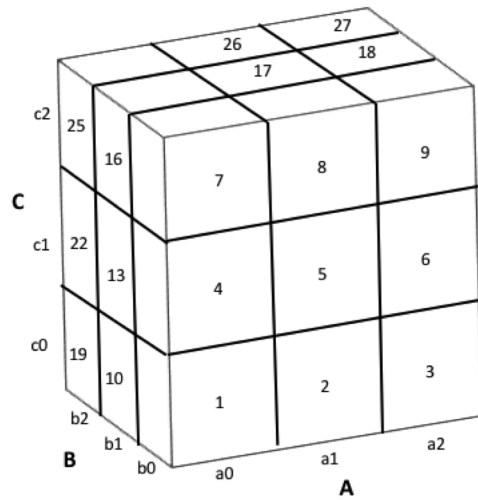


Figure 4: Figure 1: A 3-D array with dimensions A, B and C. This array is divided into 27 smaller chunks.

5/1. (5 points) Given the following database with $minsup = 0.6$.

TransactionID	Items
T100	K,A,D,B,C
T200	D,A,E,F
T300	C,D,B,E
T400	B,A,C,K,D
T500	A,G,C

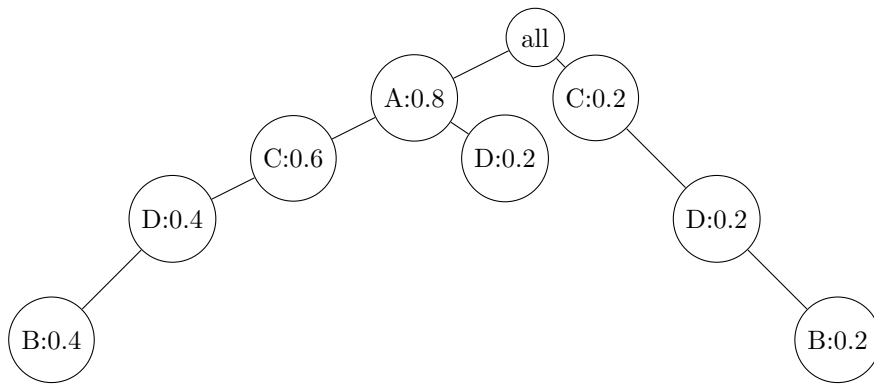
- Generate an ordered list of frequent items based on the raw transaction database.
Hint: Reorder items within each transaction according to their frequencies in the whole database.
- Generate FP-tree of this transaction database based on the frequent item list.

Solution.

- 2 marks (Don't care about order)

TransactionID	Items
T100	A,D,C,B
T200	D,A
T300	C,D,B
T400	A,C,D,B
T500	A,C

- 3 marks



5/2. (5 points) Given the following database with $minsup = 0.4$.

TransactionID	Items
T100	A,B,C,D
T200	A,B,C,E
T300	A,B,E,F,H
T400	A,C,H

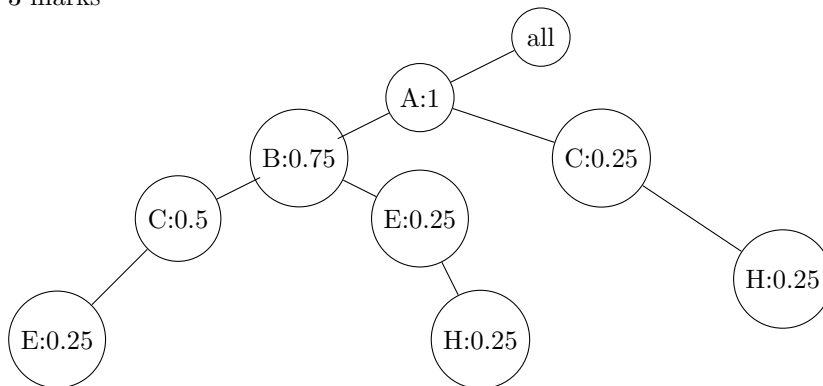
- Generate an ordered list of frequent items based on the raw transaction database.
Hint: Reorder items within each transaction according to their frequencies in the whole database.
- Generate FP-tree of this transaction database based on the frequent item list.

Solution.

- 2 marks(Don't care about order)

TransactionID	Items
T100	A,B,C
T200	A,B,C,E
T300	A,B,E,H
T400	A,C,H

- 3 marks



5/3. (5 points) Given the following database with $minsup = 0.4$.

TransactionID	Items
T100	K,A,D,B,C,E
T200	D,A,E,F
T300	K,C,D,B,E
T400	B,A,C,K,E
T500	A,G,C

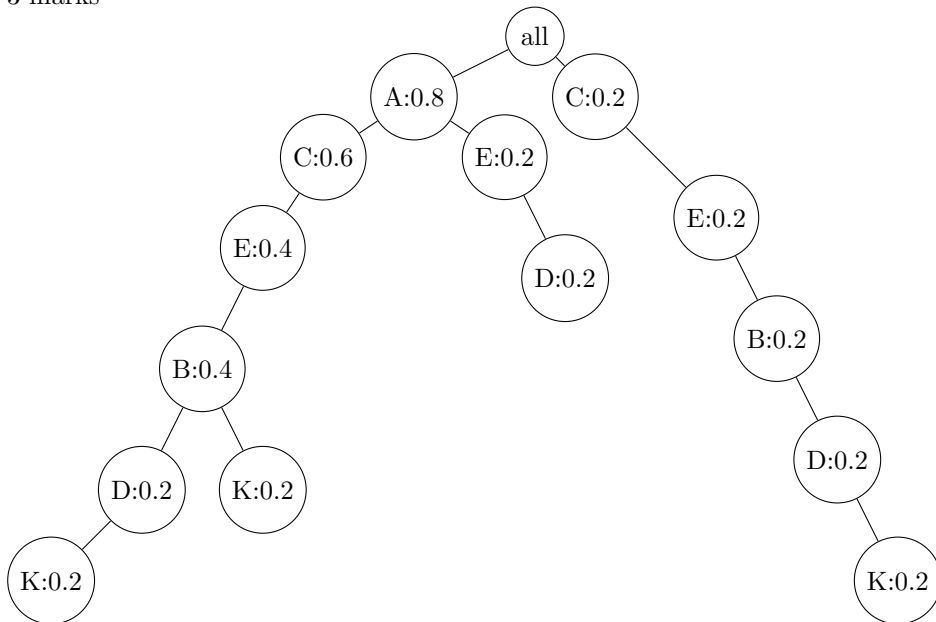
- A. Generate an ordered list of frequent items based on the raw transaction database.
Hint: Reorder items within each transaction according to their frequencies in the whole database.
- B. Generate FP-tree of this transaction database based on the frequent item list.

Solution.

A. 2 marks

TransactionID	Items
T100	K,A,D,B,C,E
T200	D,A,E
T300	K,C,D,B,E
T400	B,A,C,K,E
T500	A,C

B. 3 marks



6/1. (10 points) Consider the following transaction database:

TransactionID	Items
T1	A,B,C,D
T2	A,B,C,E
T3	A,B,E,F,H
T4	A,C,H

Suppose that minimum support is set to 50% and minimum confidence to 60%.

- List all frequent item sets together with their support.
- Which of the item sets from A) are closed? Which of the item sets from A) are maximal?
- List at least 2 association rules with $minconf = 0.6$ from the frequent maximal patterns computed in part B.

Solution.

-
- 4 marks (Partial marks if missed some rules)
 $A = 1, B = 0.75, C = 0.75, E = 0.5, H = 0.5,$
 $AB = 0.75, AC = 0.75, AE = 0.5, AH = 0.5, BC = 0.5, BE = 0.5$
 $ABC = 0.5, ABE = 0.5$
 - 4 marks (2 for closed, 2 for maximal) Partial marks if missed some rules
 Closed : A, AB, AC, AH, ABC, ABE
 Maximal : AH, ABC, ABE
 - 2 marks for any two rules
 ABC
 $AB- > C \ 0.66, AC- > B \ 0.66, BC- > A \ 1, B- > AC \ 0.66, C- > AB \ 0.66$
 ABE
 $AB- > E \ 0.66, AE- > B \ 1, BE- > A \ 1, B- > AE \ 0.66, E- > AB \ 1$
 AH
 $H- > A \ 1$

