

Unit - 3

Greedy Algorithm & Dynamic Programming

Greedy Algorithm :-

A greedy Algorithm is an algorithmic paradigm that follows the problem solving heuristic of making the locally optimal choice at each stage with the hope of finding a global optimum.

It basically based on "take whatever you can get" strategy.

Greedy is a strategy that works well on optimization problems with following characteristics :-

- (a) Greedy-choice property :- A global optimum can be arrived at by selecting a local optimum
- (b) Optimal substructure :- An optimal solution to the problem contains an optimal solution to subproblem.

Examples of Greedy Algorithm :-

- Huffman Coding
- Fractional Knapsack Problem
- Kruskal's algorithm for Minimum Spanning Tree.
- Prim's algorithm for Minimum Spanning Tree (MST).

Huffman Coding :-

Huffman Coding is a lossless data compression algorithm. The idea is to assign variable-length codewords to input characters, lengths of codes are based on frequency of corresponding characters.

The most frequent character gets the smallest code and the least frequent character gets the largest code.

Not → The codes are assigned in such a way that the code assigned to one character is not a prefix of any code assigned to any other character. This is how huffman coding make sure that there is no ambiguity when decoding the generated bit stream.

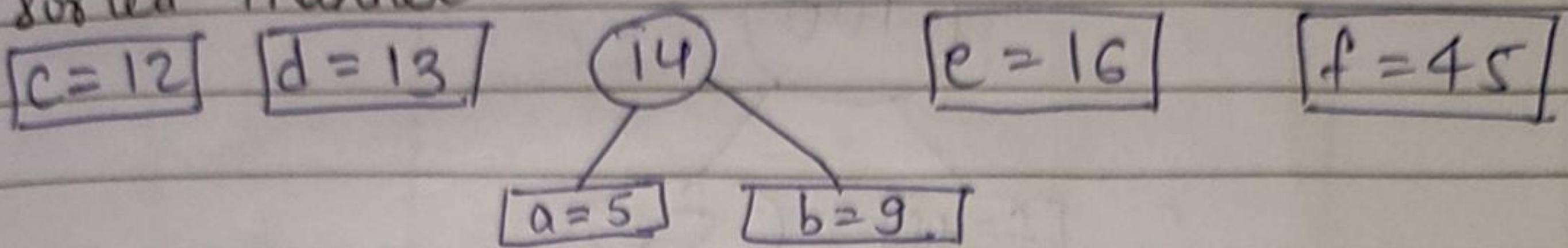
<u>Q.</u>	Character	Frequency
a	5	
b	9	
c	12	
d	13	
e	16	
f	45	

By using Huffman Coding find codeword for each character.

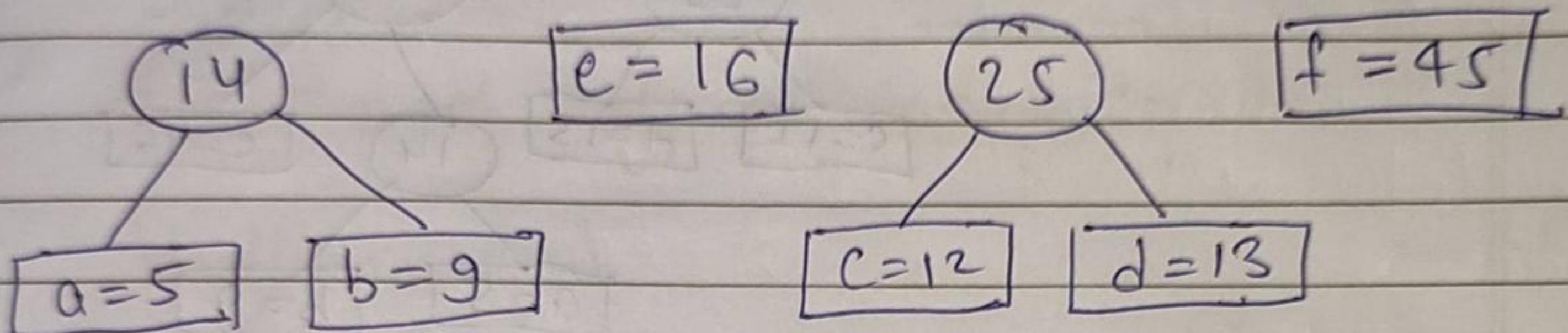
Ans → Step 1 :- Arrange all the character's in ascending order :

a b c d e f
5 9 12 13 16 45

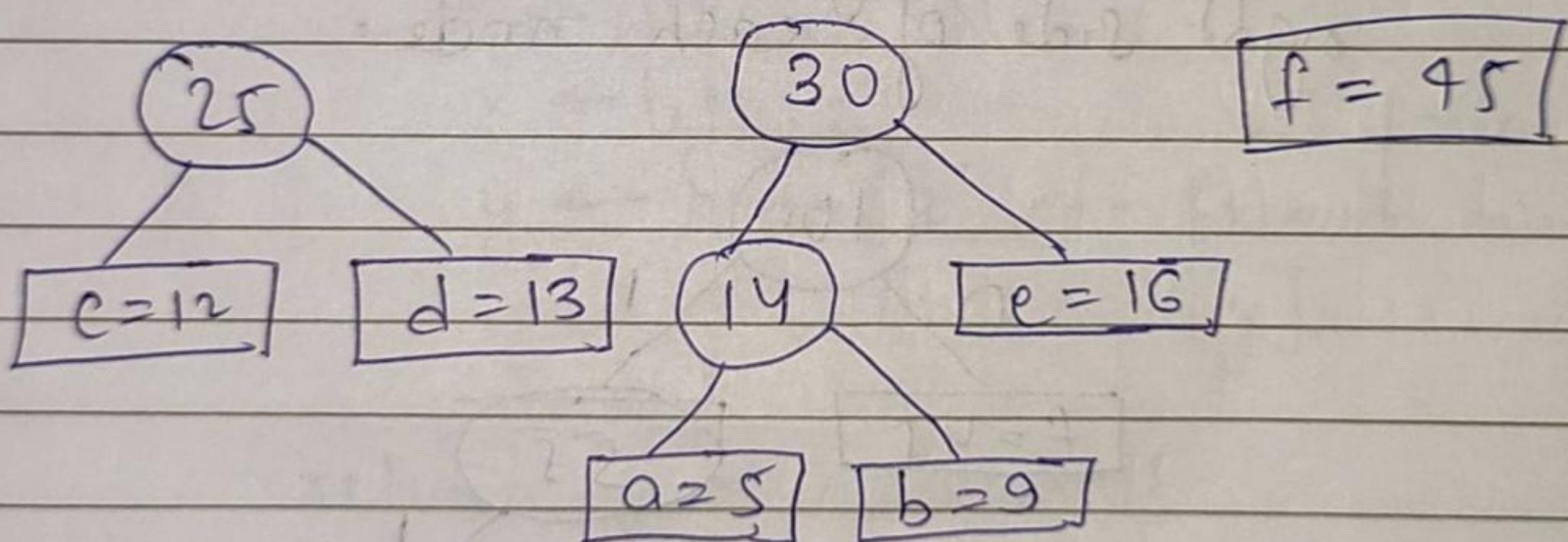
Step 2 :- Merge two smaller order of frequency
i.e. a and b in this case and put it in
sorted manner.



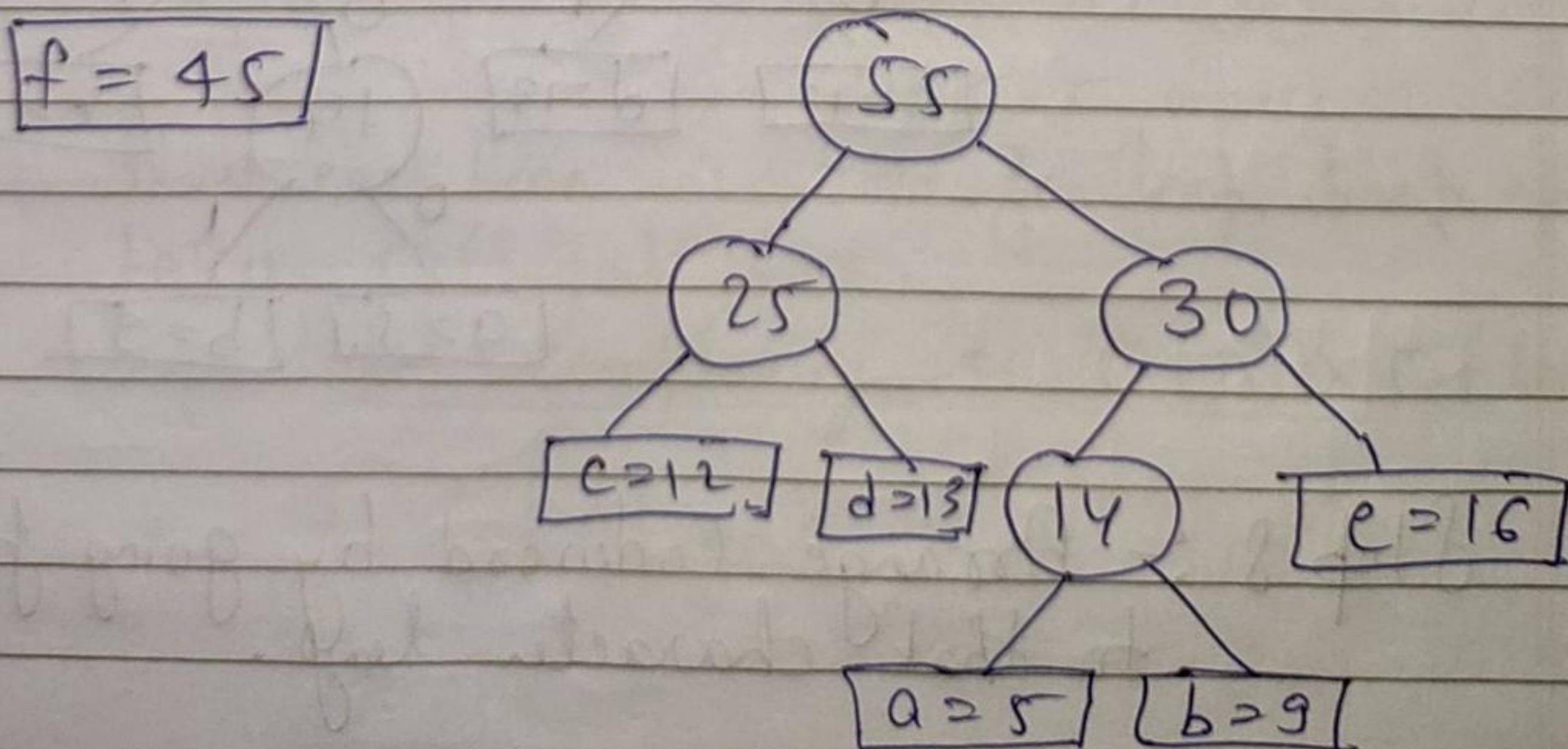
Step 3 :- Repeat step 2 :- c and d in this case.



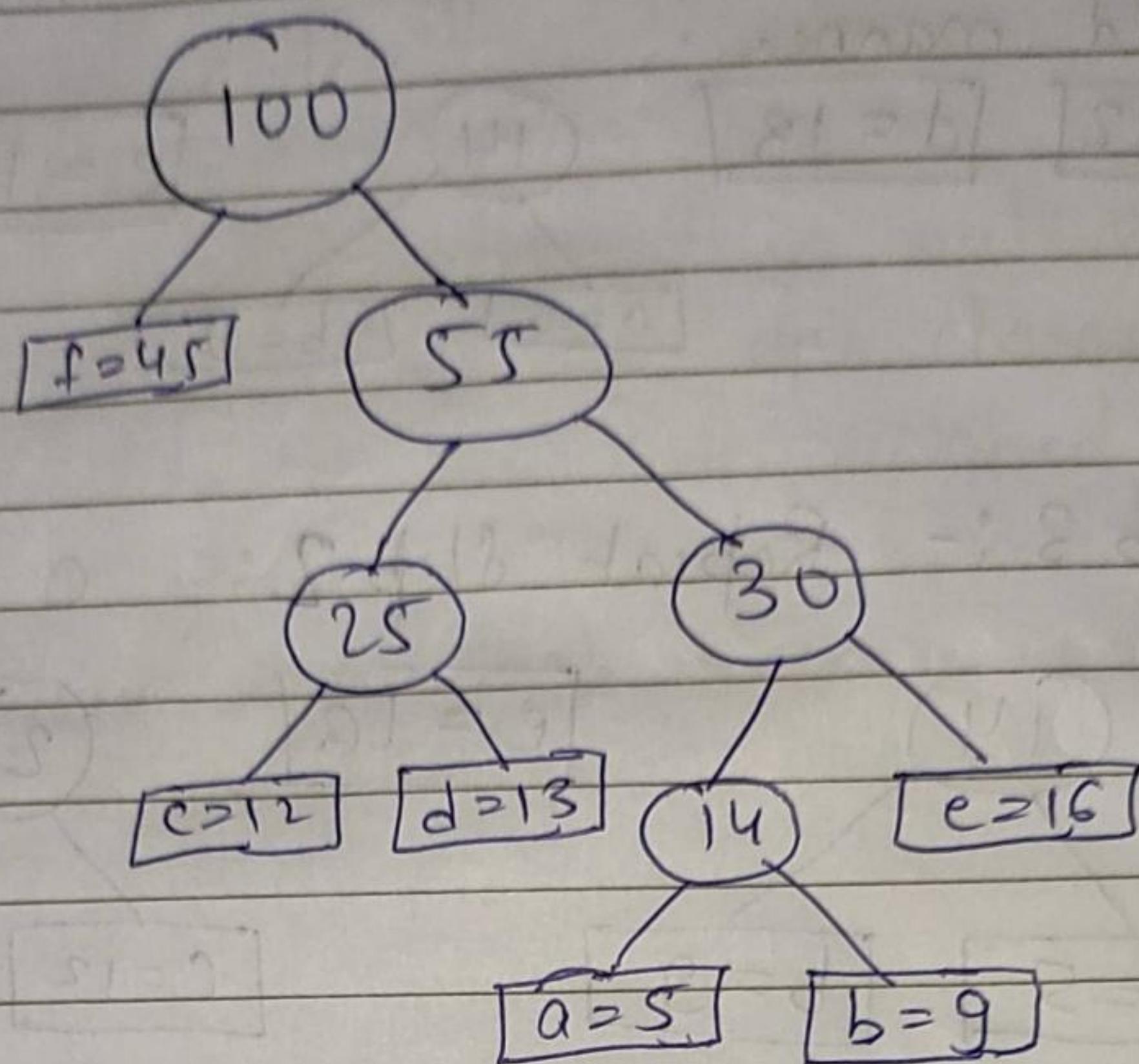
Step 4 :- Repeat step 2 :- 14 & 16 this time.



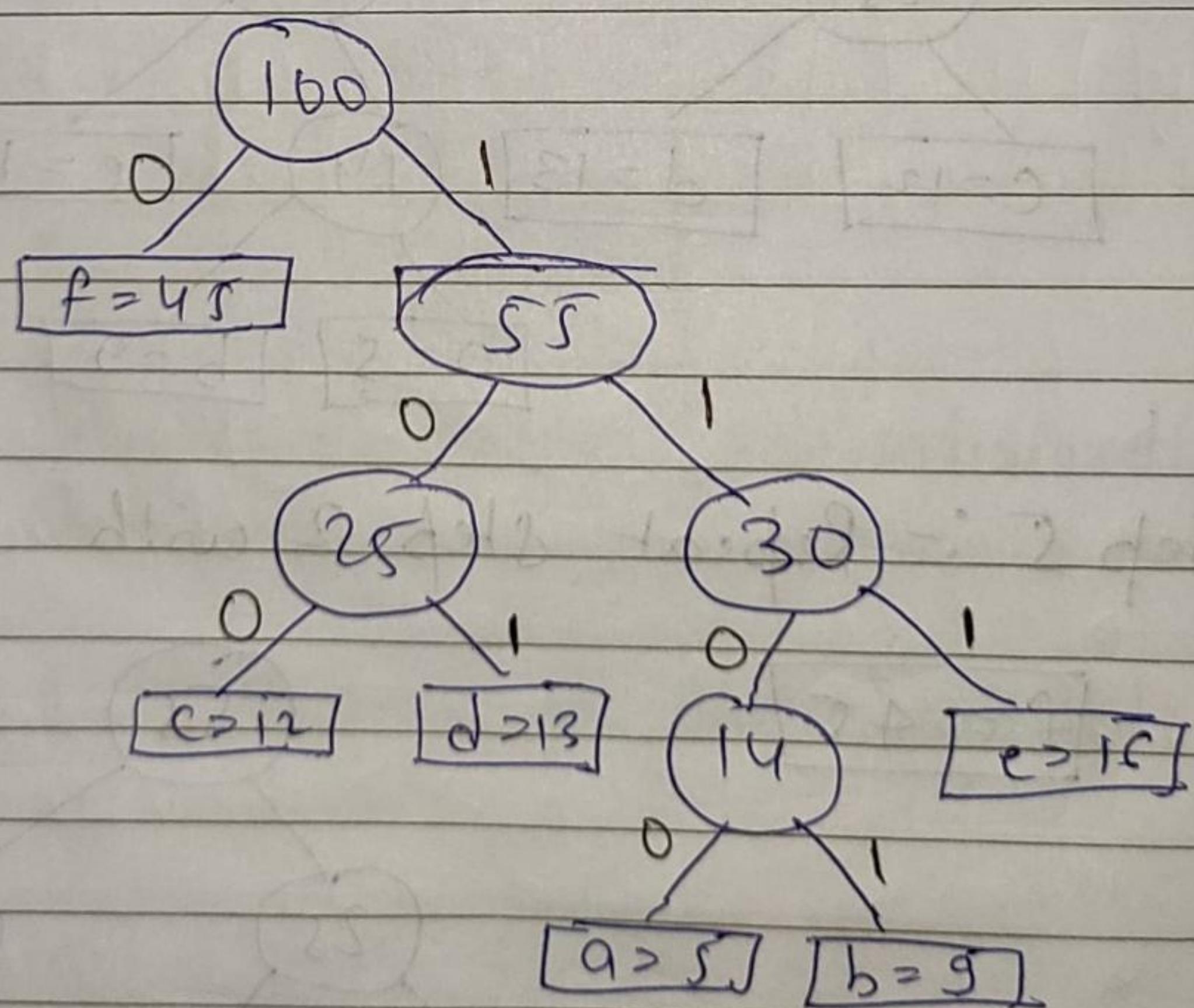
Step 5 :- Repeat step 2 with 25 & 30 this time



Step 6 :- Repeat Step 2 with 45 & 55 this time



Step 7 :- Now, when tree is complete, assign 0 to the left side and 1 to the right side of each node.



Step 8 :- Arrange Codeword by going from root to that character leaf.

char	frequency	Codeword
a	5	1100
b	9	1101
c	12	100
d	13	101
e	16	111
f	45	0

Ans

Algorithm of Huffman coding :-

Huffman (c)

$n \leftarrow |c|$

$Q \leftarrow c$

for $i \leftarrow 1$ to $n-1$ do

$z \leftarrow \text{Allocate_Node}()$

$x \leftarrow \text{left}[z] \leftarrow \text{Extract_min}(Q)$

$y \leftarrow \text{right}[z] \leftarrow \text{Extract_min}(Q)$.

$f[z] \leftarrow f[x] + f[y]$.

$\text{Insert } (Q, z)$.

return $\text{Extract_min}(Q)$.

Analysis :-

* for loop will run $n-1$ times. So for for loop complexity is of order $O(n)$.

Now, each time inside the for loop, heap operation takes $O(\log n)$ time.

So, total complexity = $O(n) \times O(\log n)$.

= $O(n \log n)$

char	frequency
a	4
b	5
c	7
d	8
e	10
f	12
g	20

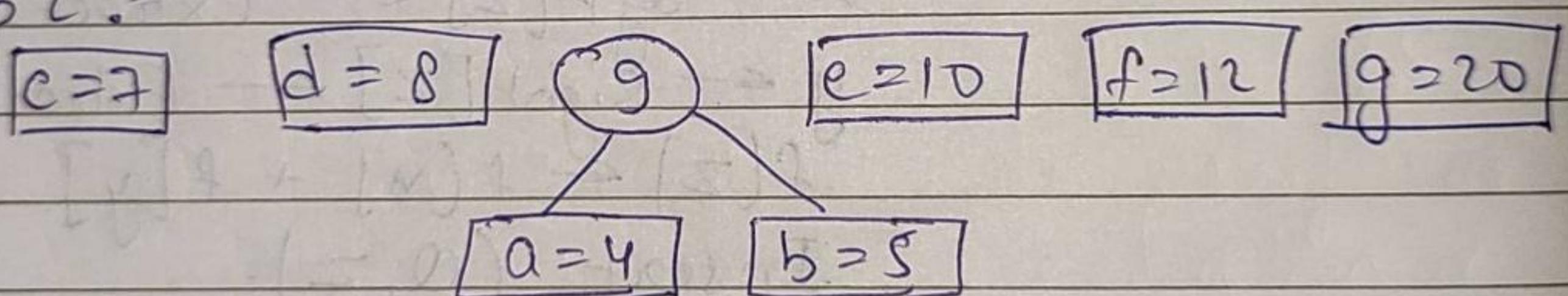
Find codeword of each character using Huffman coding.

Ans →

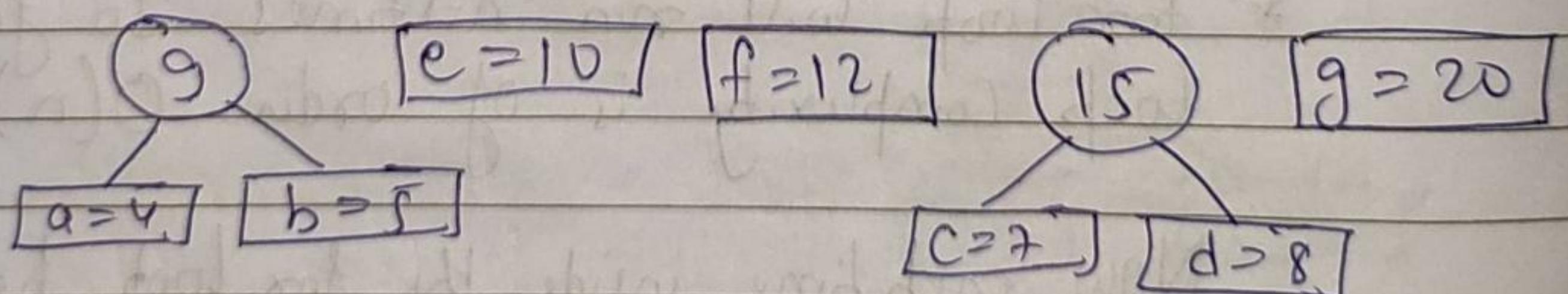
Step 1 :-

a	b	c	d	e	f	g
4	5	7	8	10	12	20

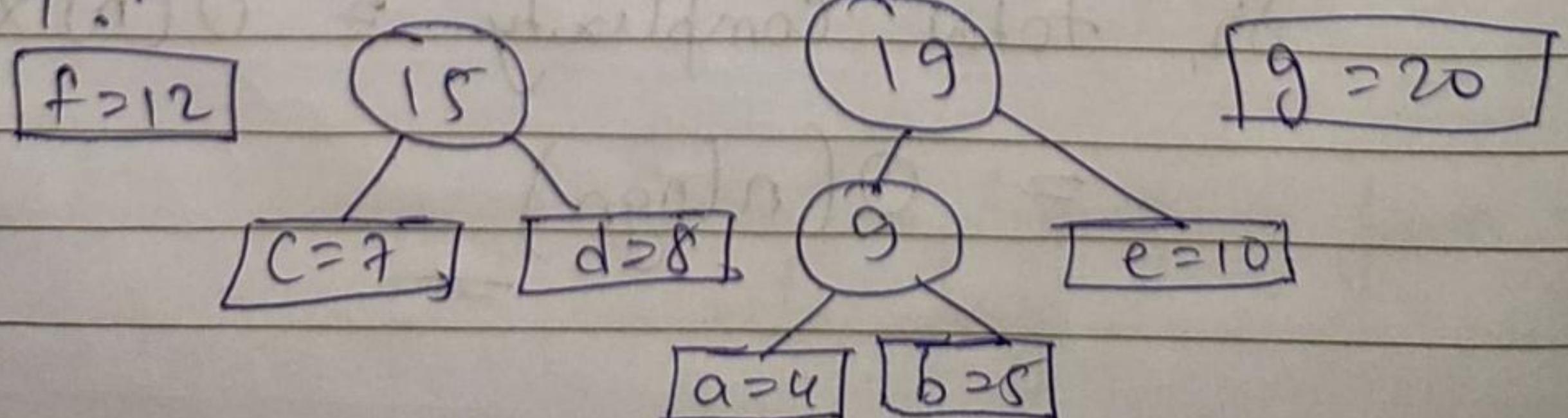
Step 2 :-



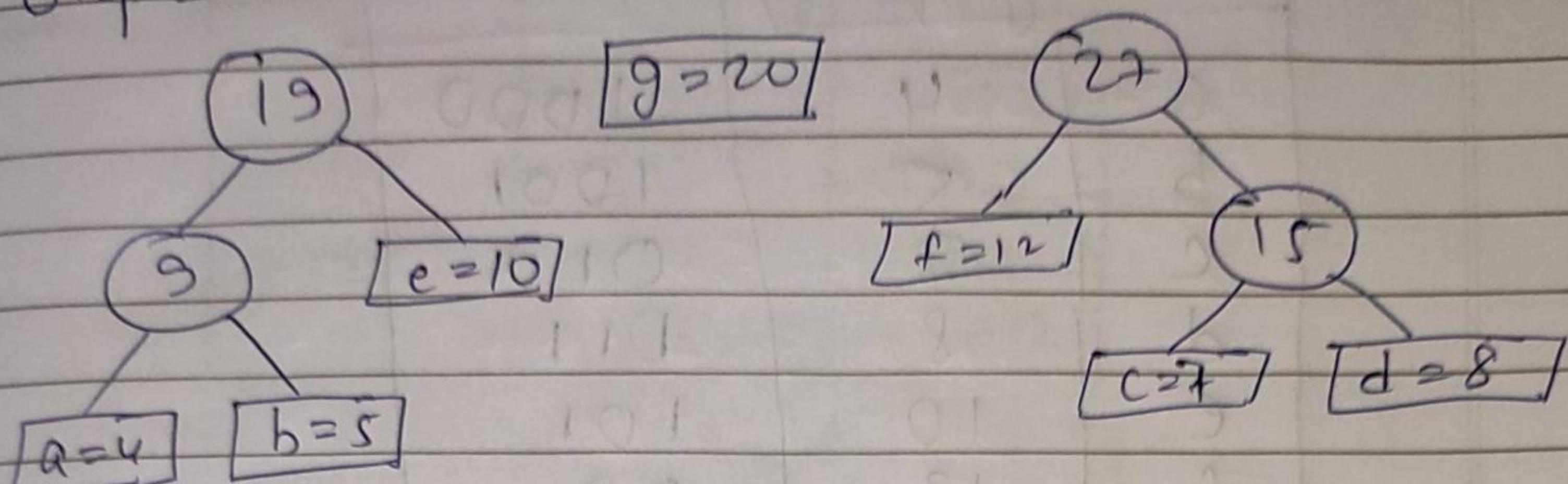
Step 3 :-



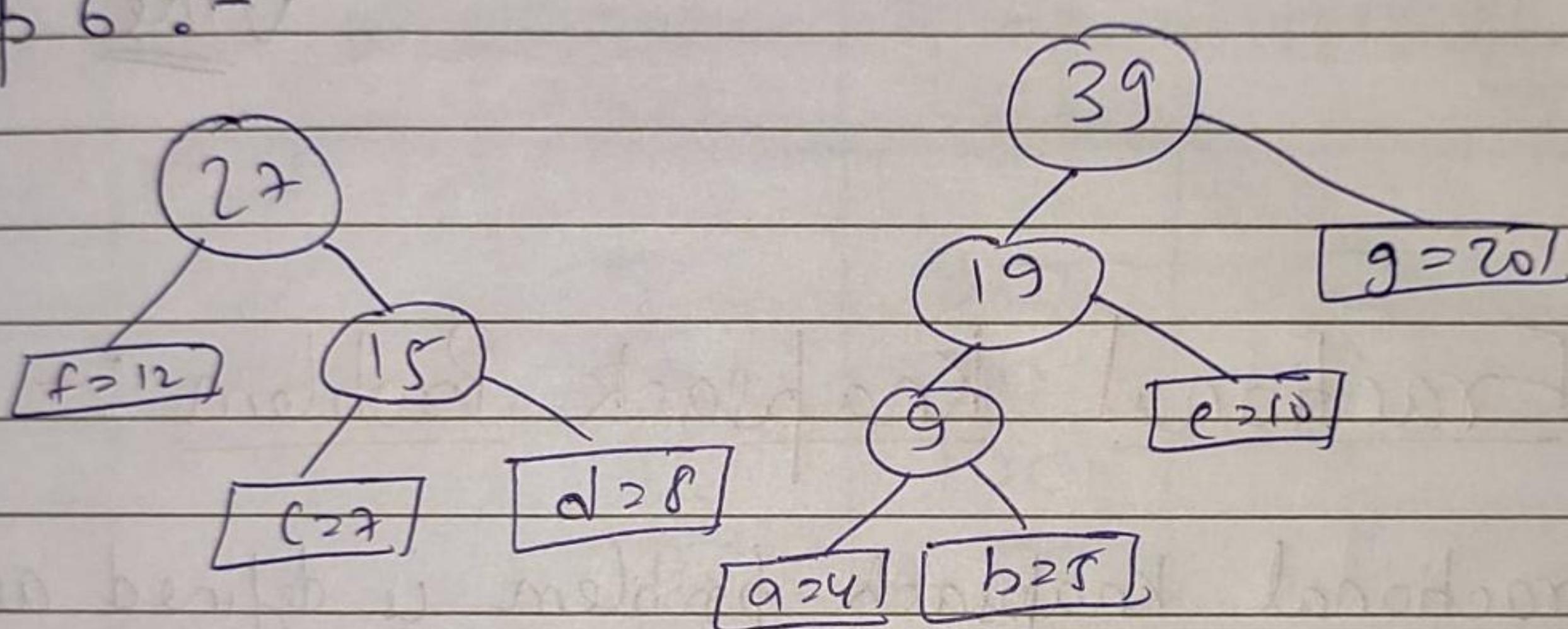
Step 4 :-



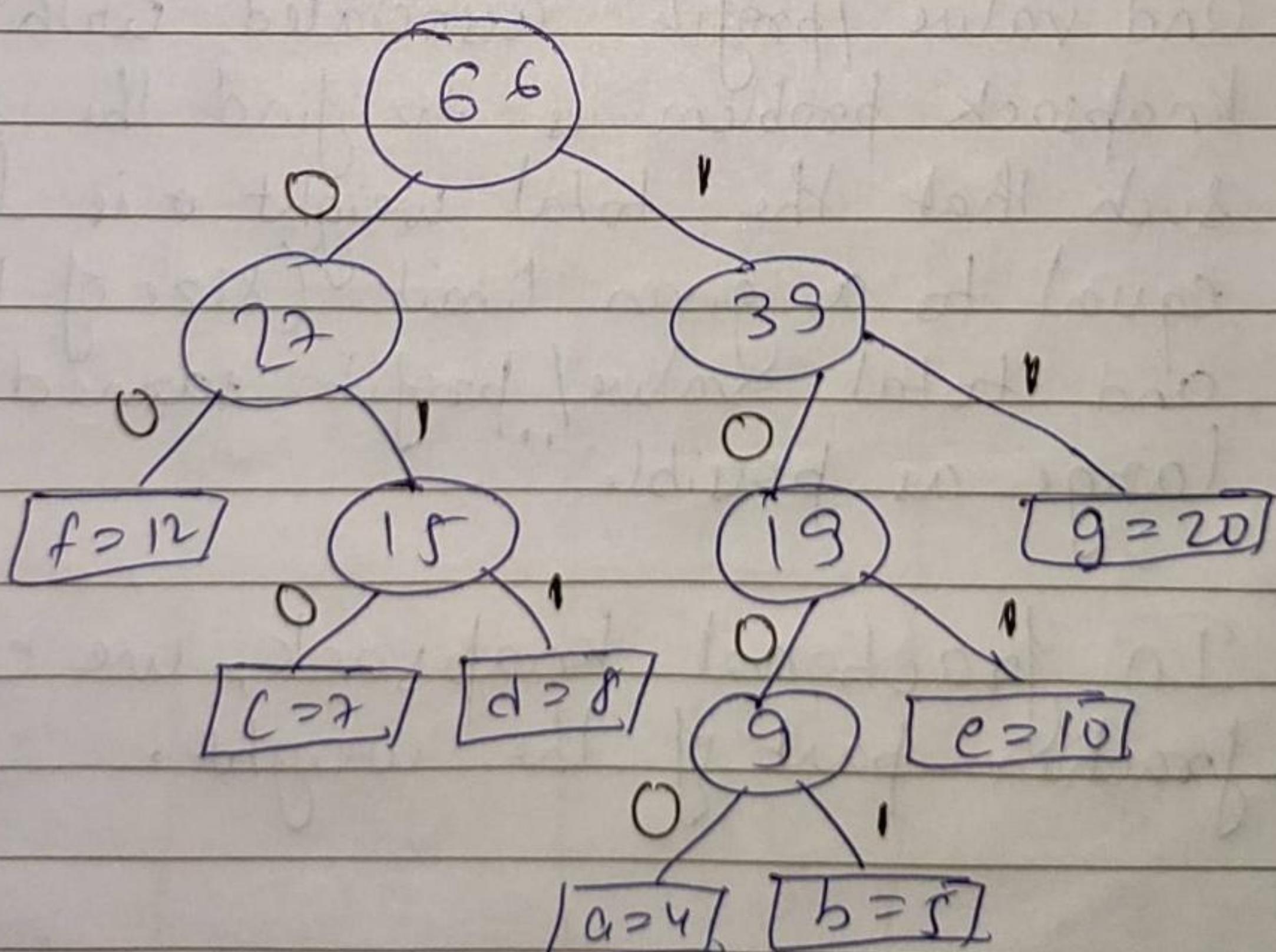
Step 5 :-



Step 6 :-



Step 7 :-



char	frequency	Codeword
a	4	1000
b	5	1001
c	7	010
d	8	011
e	10	101
f	12	00
g	20	11

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Fractional Knapsack Problem :-

Fractional knapsack problem is defined as "Given a set of items having some weight and value/profit associated with it. The knapsack problem is to find the set of items such that the total weight is less than or equal to a given limit (size of knapsack) and total value/profit earned is as large as possible".

In fractional knapsack, we can take fraction part of the weight.

Q.

Items	Weight	Value
I ₁	5	30
I ₂	10	20
I ₃	20	100
I ₄	30	90
I ₅	40	160

Given knapsack weight = 60 kg.

Ans →

Items (I _i)	Weight (w _i)	Value (v _i)	P _i = $\frac{V_i}{W_i}$
I ₁	5	30	6
I ₂	10	20	2
I ₃	20	100	5
I ₄	30	90	3
I ₅	40	160	4

Now, we sort it according to P_i value in decreasing order.

Items	Weight	Value	P _i = $\frac{V_i}{W_i}$
I ₁	5	30	6
I ₃	20	100	5
I ₅	40	160	4
I ₄	30	90	3
I ₂	10	20	2

Now, we will chose Items one by one while checking if weight is greater than 60.

$$I_1 = 5 \text{ kg} < 60 \text{ kg}$$

$$\text{Value} = 30$$

$$I_2 = 20 \text{ kg}$$

$$\text{weight} \rightarrow 5 + 25 \leq 60 \text{ kg}$$

$$\Rightarrow \text{value} = 30 + 100 \\ = 130$$

$$I_3 = 40$$

$$\text{weight} = 40 + 25 \geq 60$$

↓
Since it is greater, we will take
fraction part of it (35 in this case)

$$I_3 = 35$$

$$\text{Total weight} = 35 + 25 = 60 \text{ kg}$$

$$\begin{aligned}\text{Value} &= 130 + 35 \times \frac{160}{40} \\ &= 130 + 140 \\ &= 270\end{aligned}$$

So, Maximum possible value = 270

& I_1, I_2 & fraction of I_3 are involved

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Algorithm of fractional knapsack :-

Fractional knapsack

for $i = 1$ to $\text{size}(v)$

do $b[i] = v[i]/w[i]$.

sort-decreasing (b).

$i = 1$

while ($w > 0$)

do

amount = $\min(w, w[i])$

solution[i] = amount

$w = w - \text{amount}$

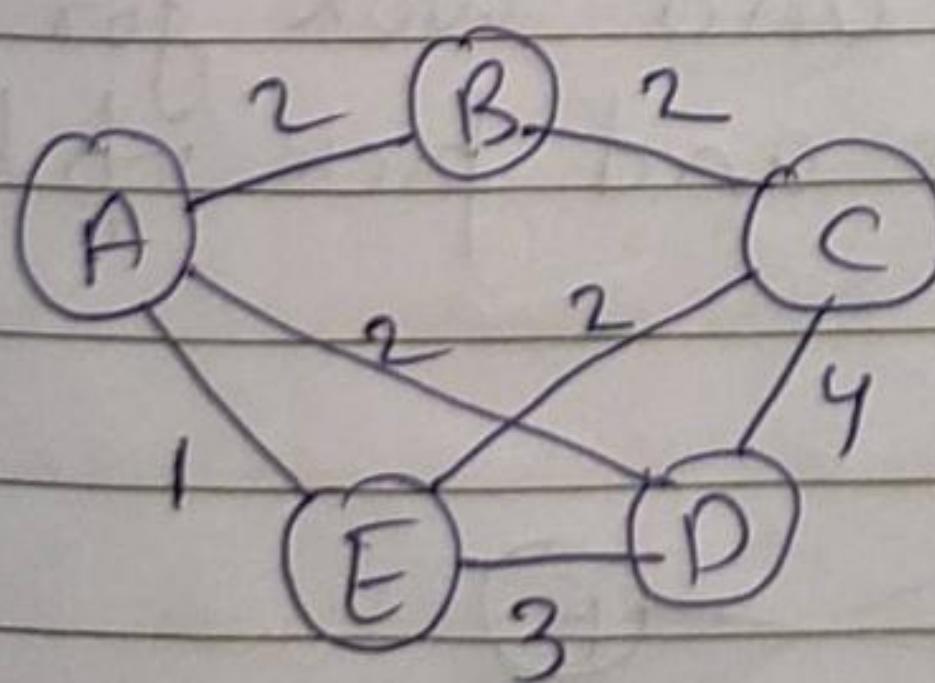
$i \leftarrow i + 1$

return solution

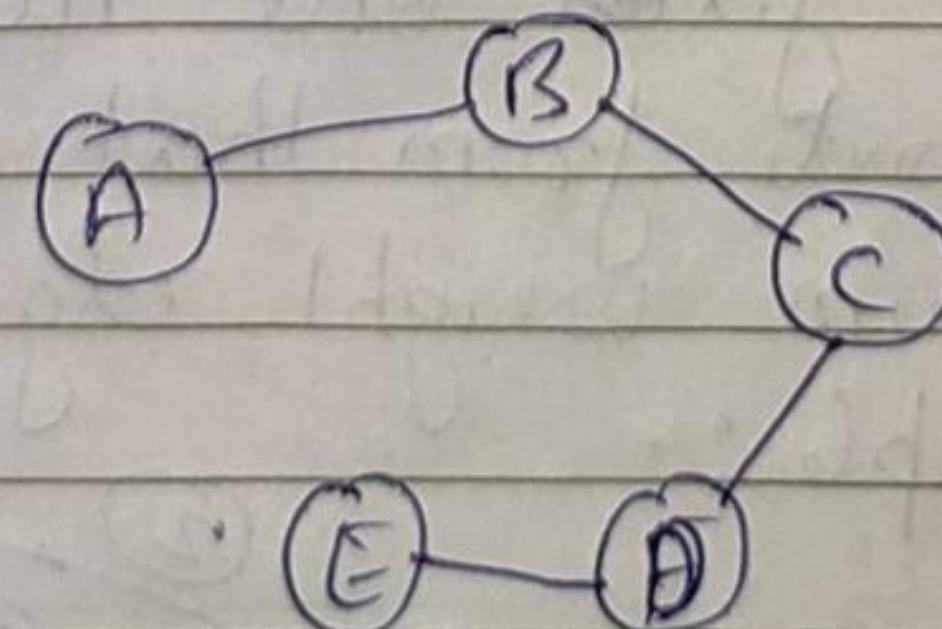
Prim's Algorithm for MST :-

* Spanning Tree :- Connected graph without any cycle.

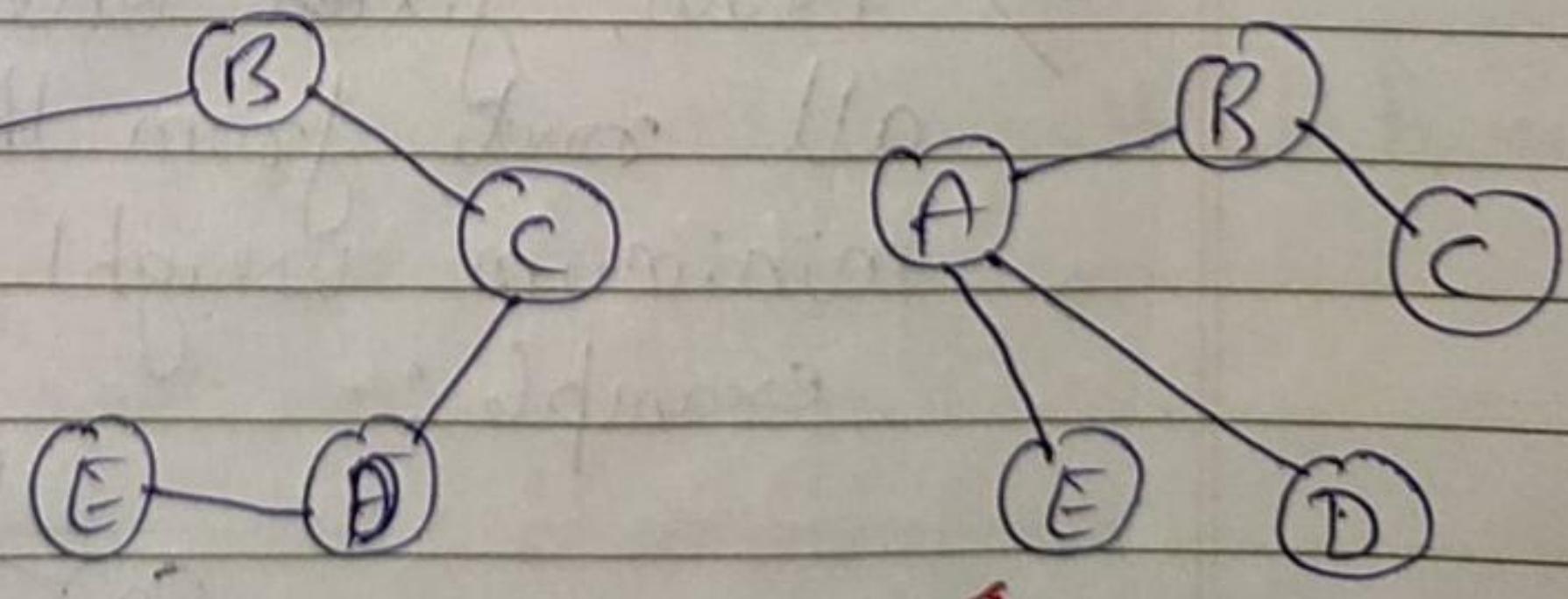
* Minimum Spanning Tree :-



Connected graph
with cycle



Connected graph
without cycle



Minimum Spanning
Tree

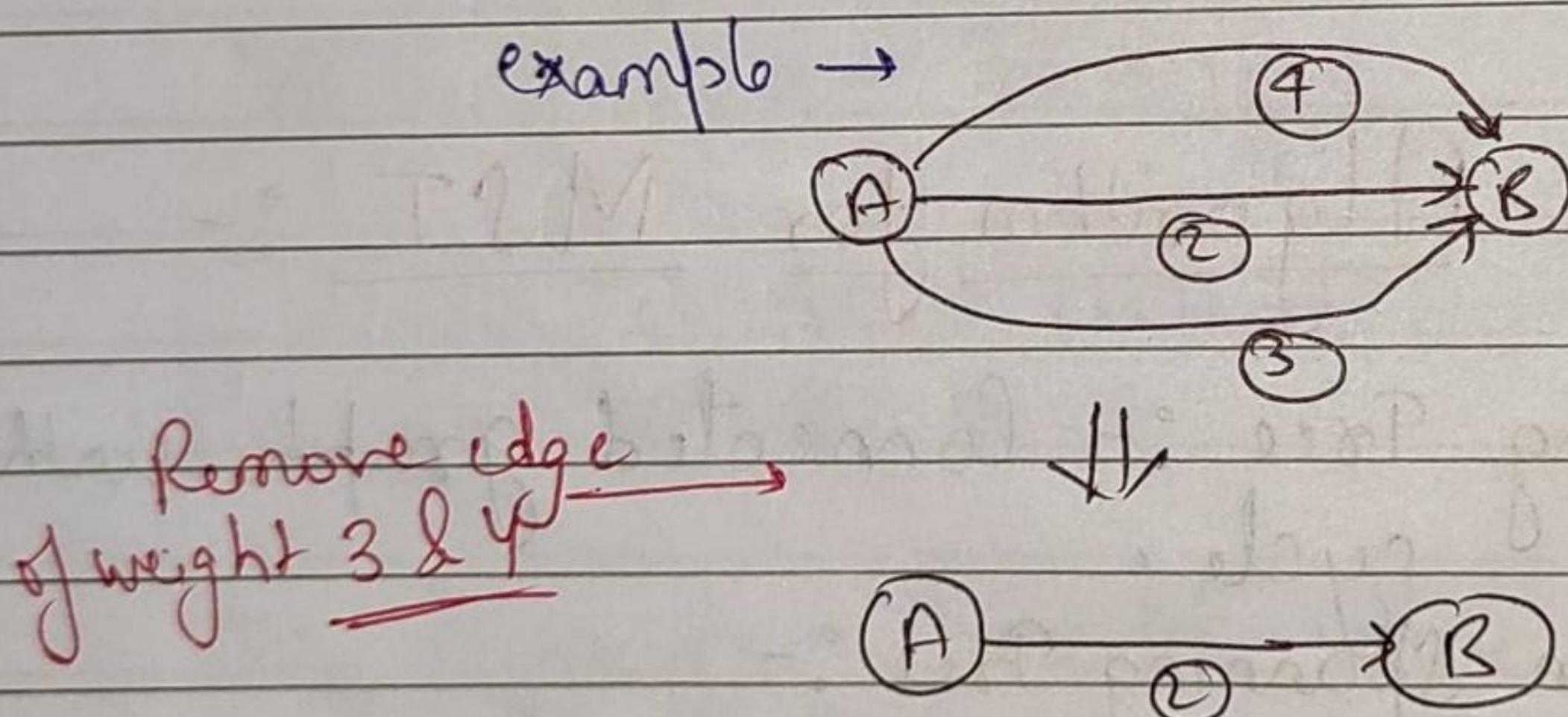
Now, to solve MST, we have two methods :-

- i) Prim's Algorithm
- ii) Kruskal's Algorithm

In this, we will talk about Prim's Algorithm :-

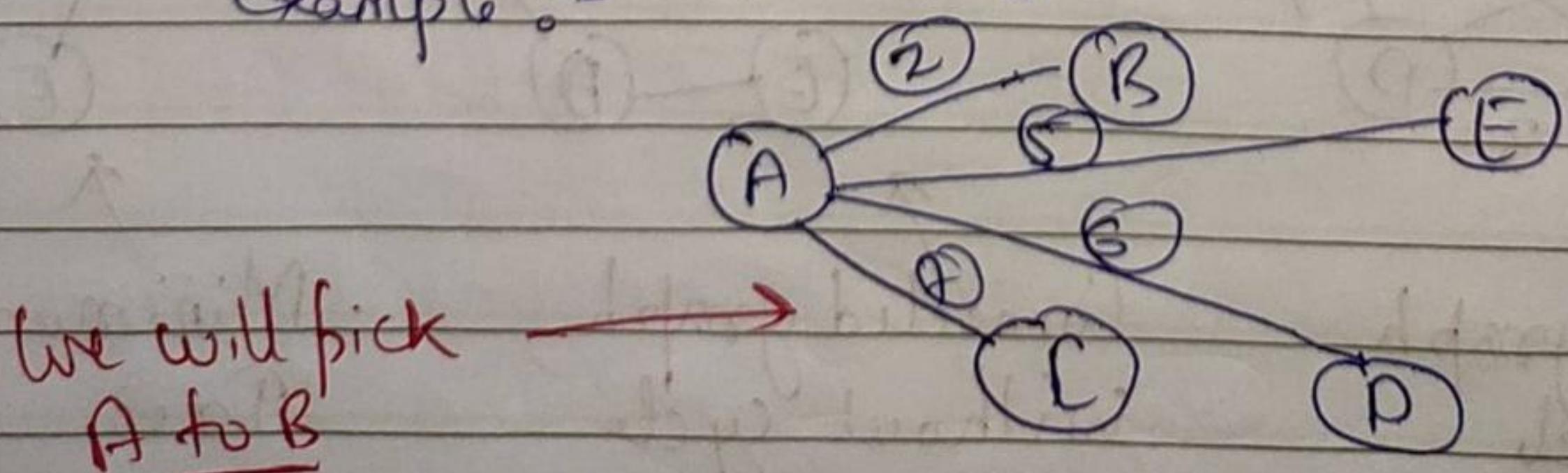
Procedure to solve Problem :-

- 1) If there are more than 1 edge in a graph, then remove all except the minimum weigh graph.



- 2) Now, fix one node, and look for all node from that node and pick up the minimum weight edge.

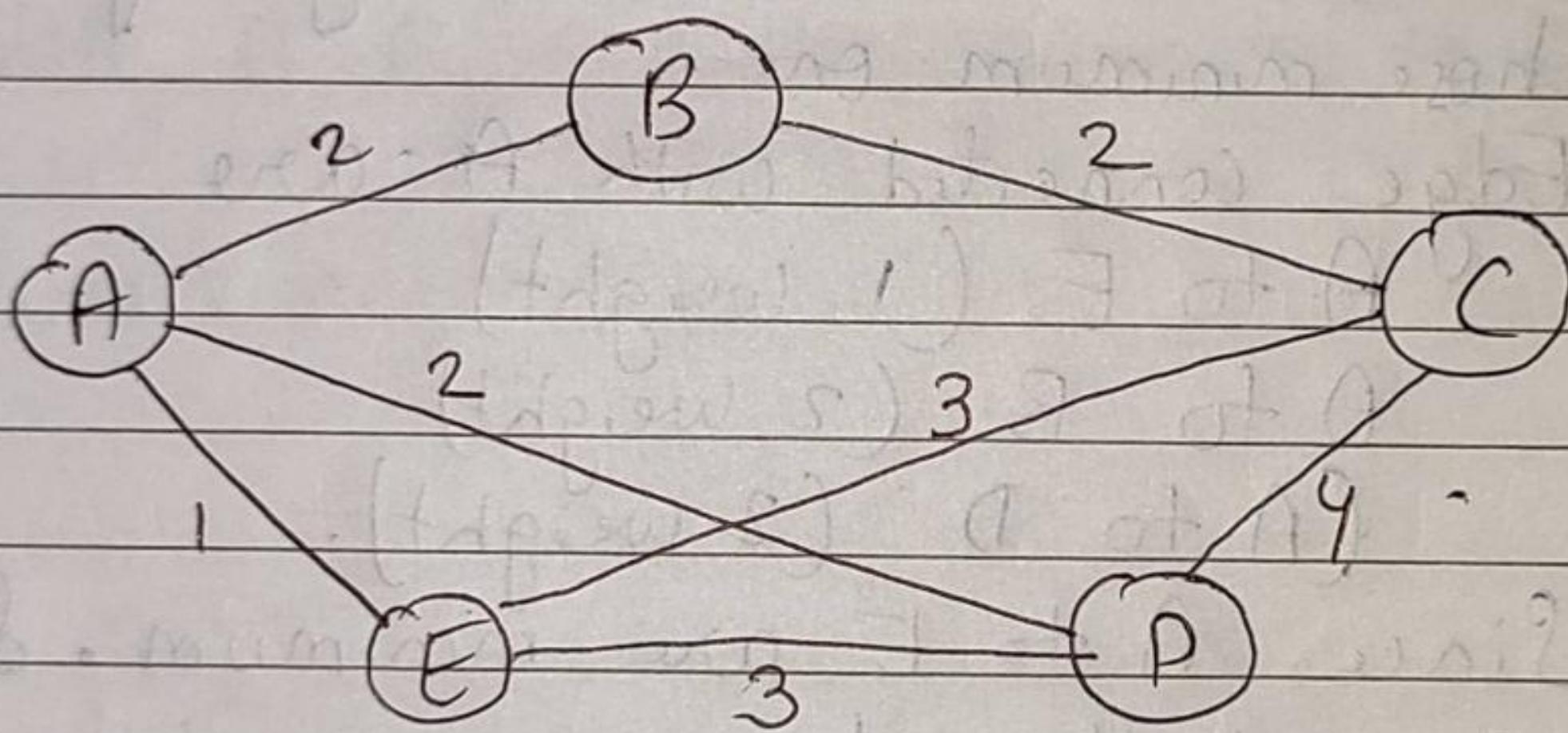
example :-



3) Repeat all the step 2 with all the connecting node.

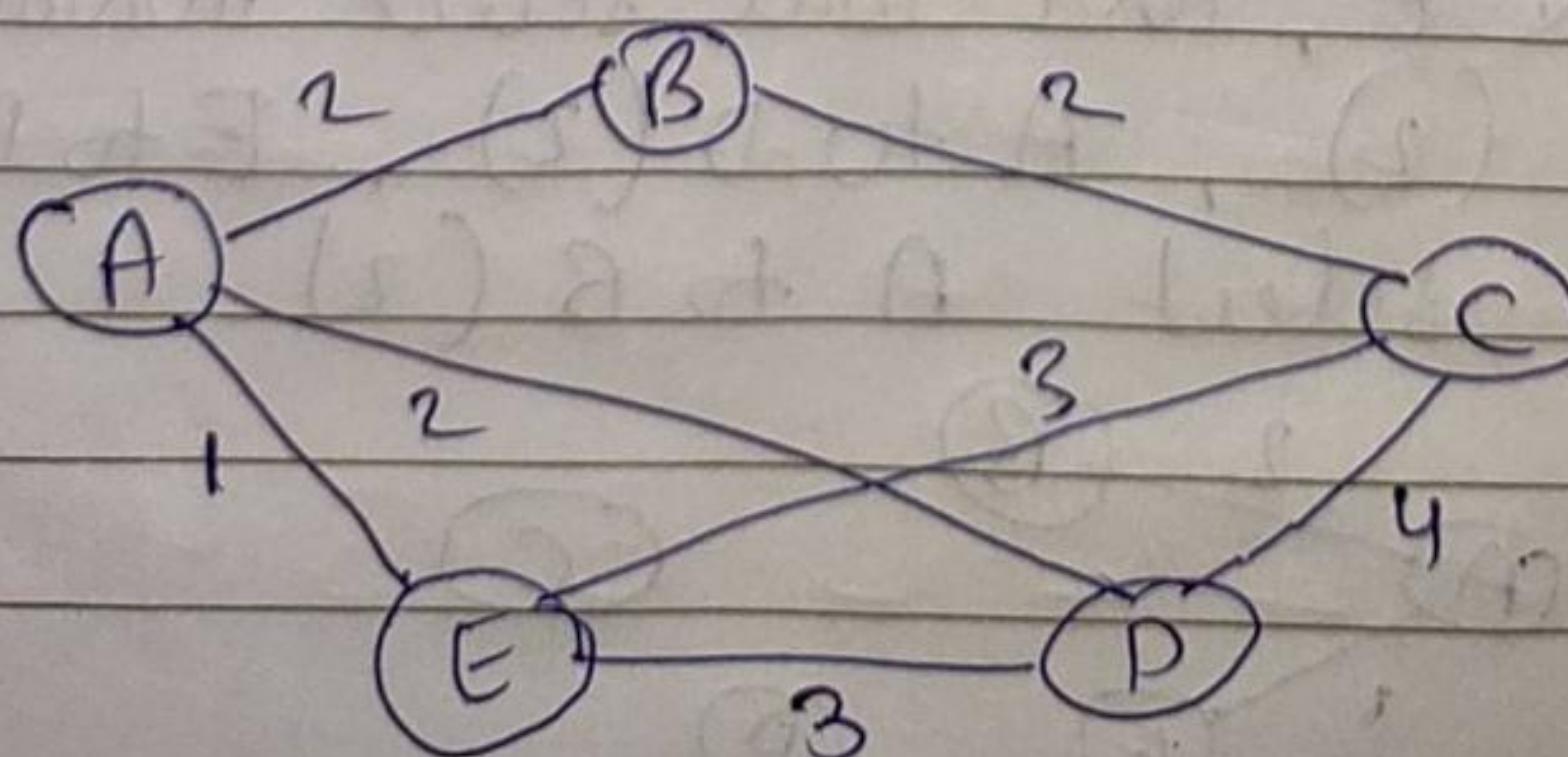
(जिसका जिसका Node Connect हो रहा है, उसमें से check करना है कि कौन सा Edge में Minimum weight है, and उसकी ओड देना है).

Q. Find Minimum Spanning Tree of this given graph using Prim's algorithm.

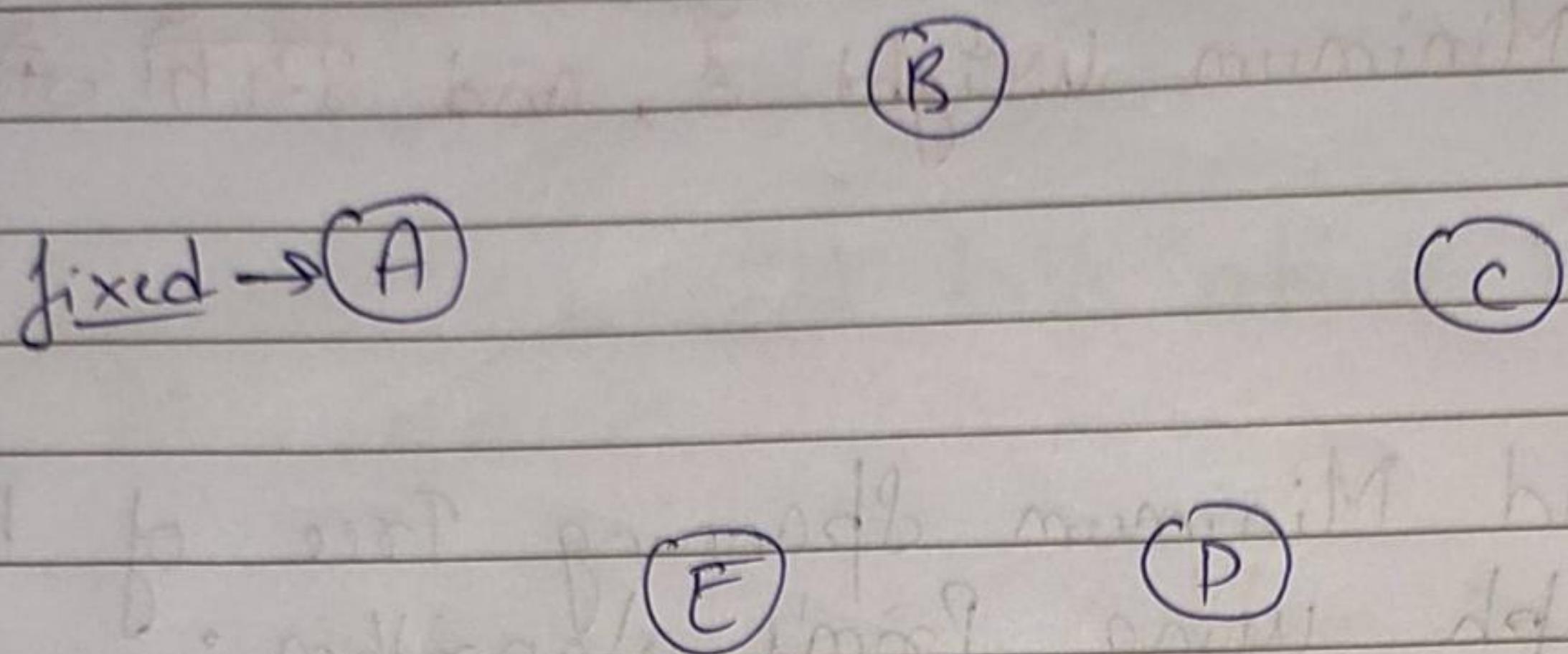


Ans → * [Note → I will explain how, we will wait in exam after this Question, I will not show entire process again and again]

Step 1 :- Remove all alternative edge path between two nodes (if available).



Step 2 :- Since, there is no fixed node given, we can take any node of our choice and fix it.



Step 3 :- Now, we see all the edge of A and chose minimum one.

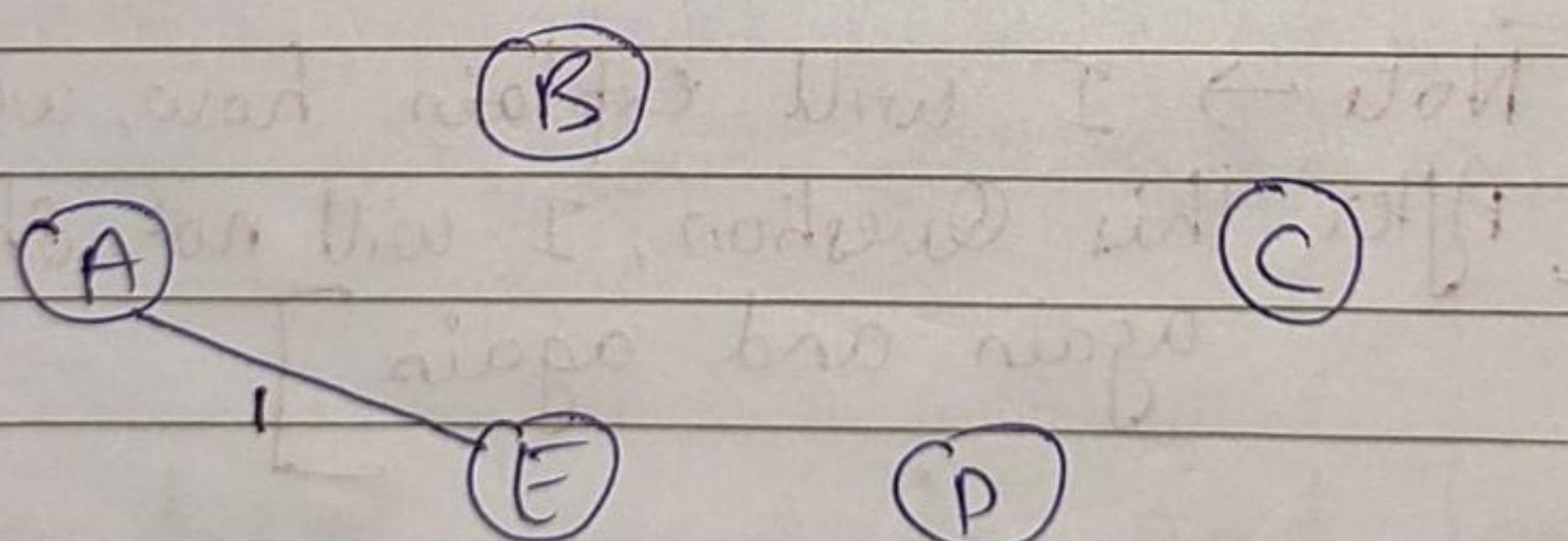
Edge connected with A are

A to E (1 weight)

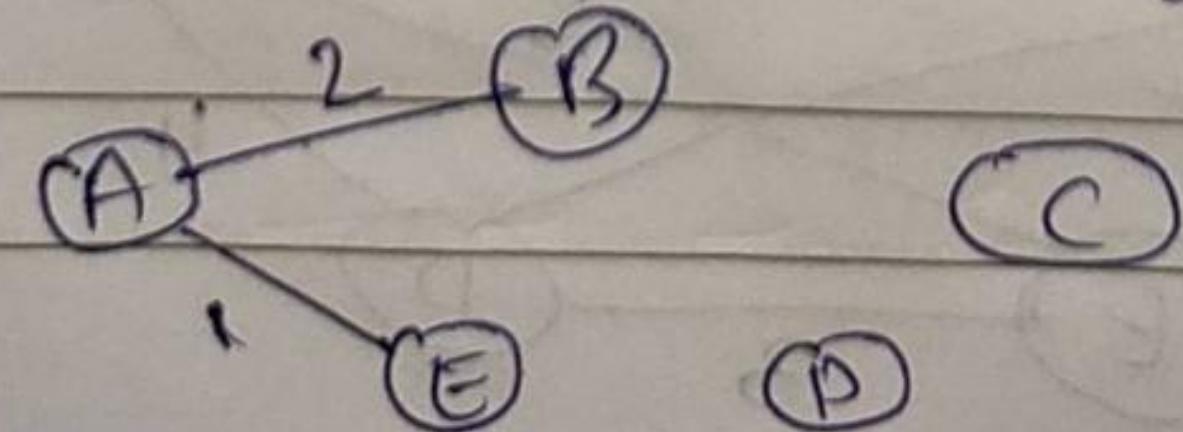
A to B (2 weight)

{A to D (2 weight)}.

Since A to E are minimum. So, we will connect these two.

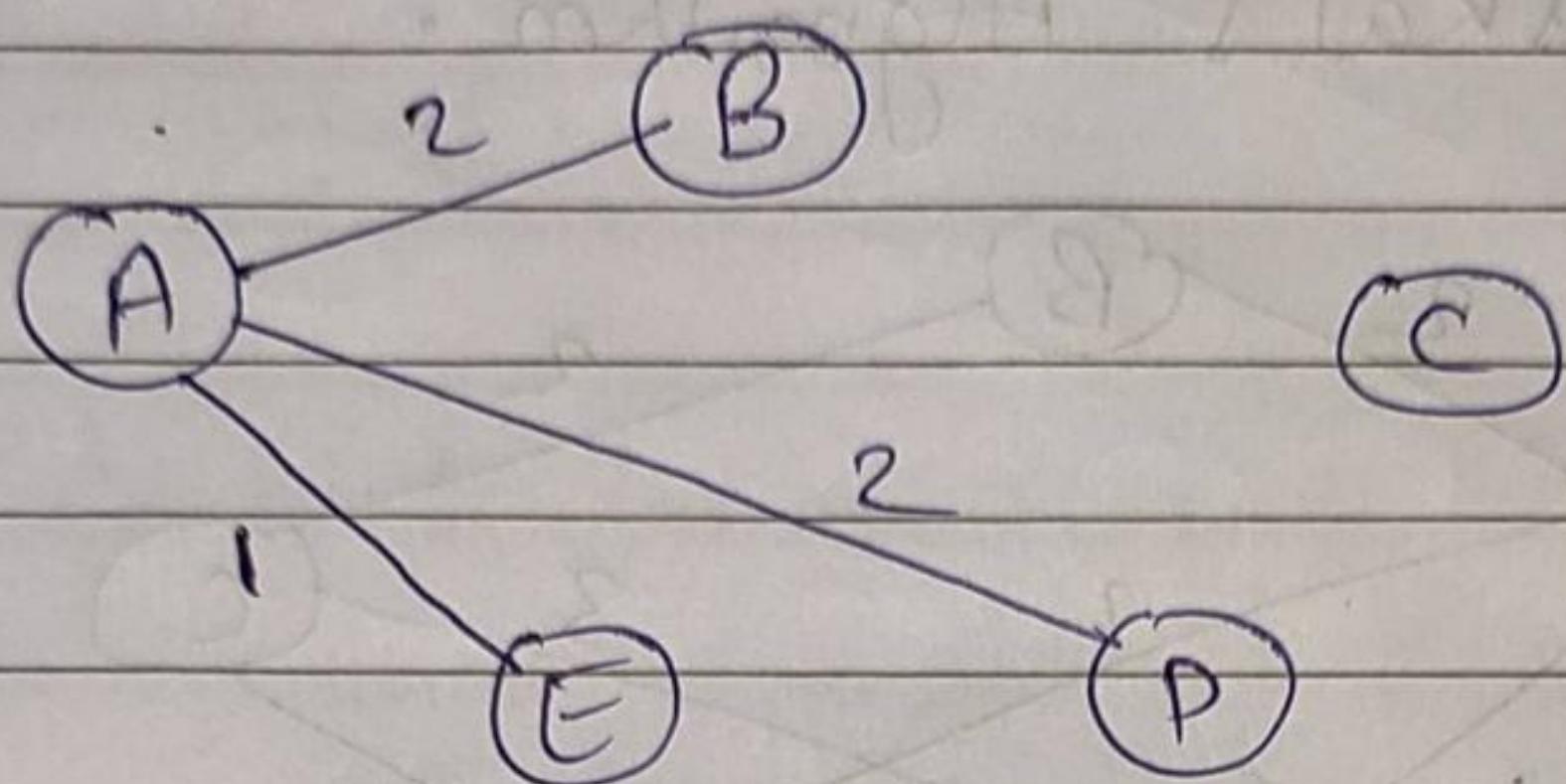


Step 4 :- Now, we will see all connected with A & E, and will select minimum one A to B (2), A to D (2), E to D (3), E to C (3) we select A to B (2).



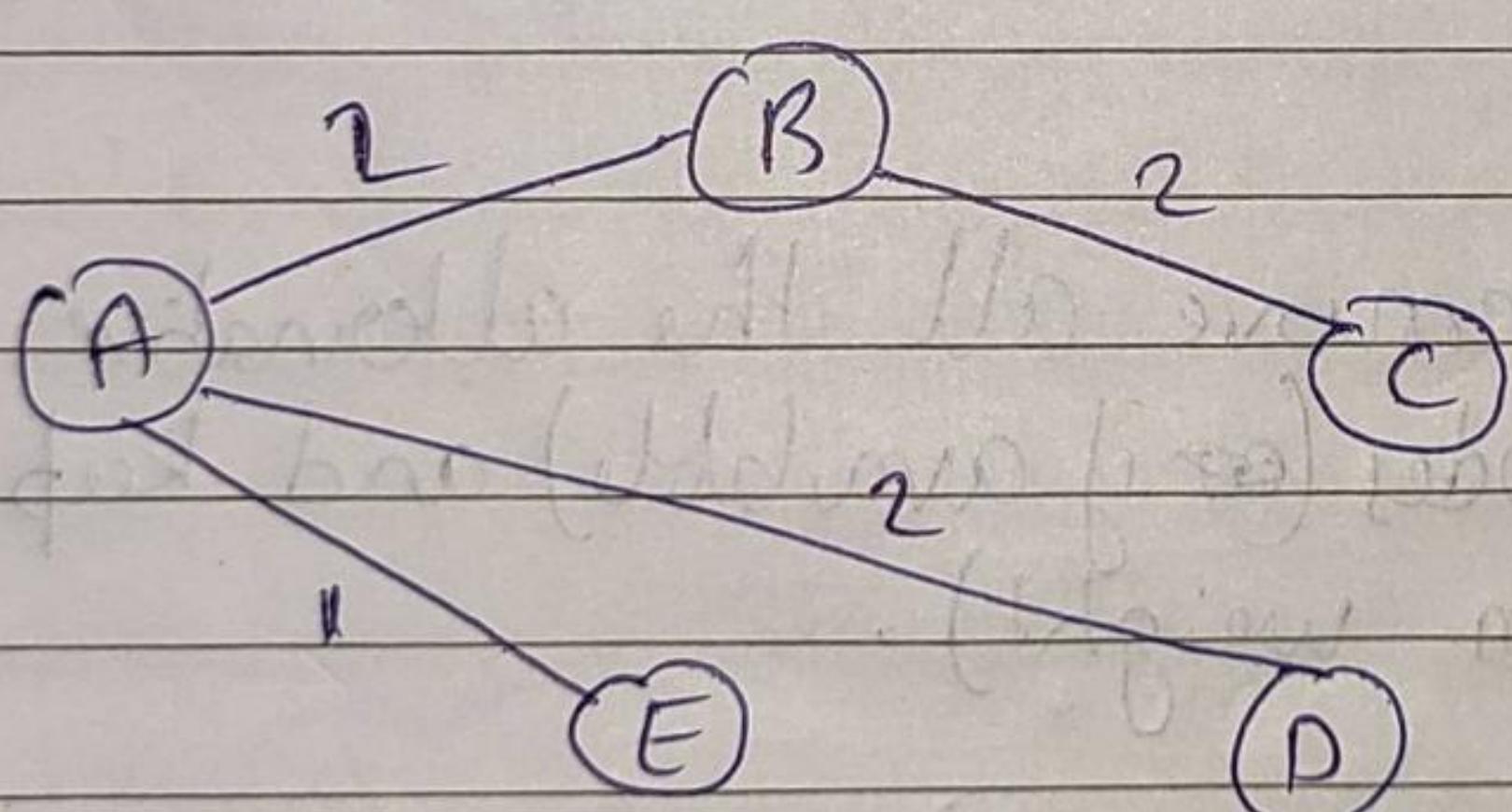
Step 5 :- Now, we will choose from all edge connected with A, B and E. i.e [A to D(2), B to C(2), E to D(3), E to C(3)]

We select A to D(2).



Step 6 :- Now, we will choose from all edge connected with A, B, E and D. i.e [B to C(2), E to D(3), E to C(3), C to D(2)]

We select B to C(2)

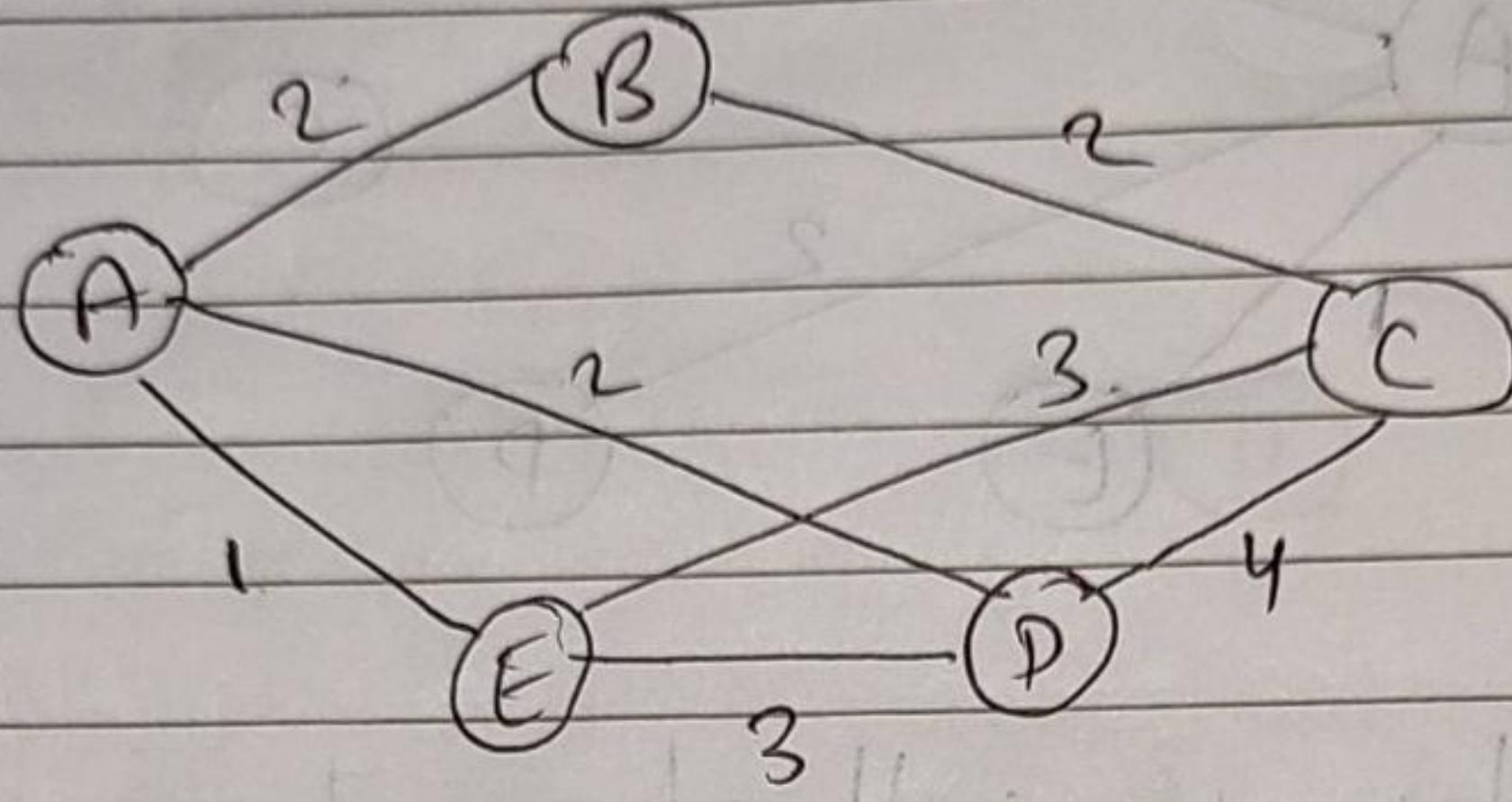


Now, all nodes are connected, so this is required minimum spanning tree.

$$\begin{aligned}\text{Weight of MST} &= 1 + 2 + 2 + 2 \\ &= 7 \quad \underline{\text{Ans}}\end{aligned}$$

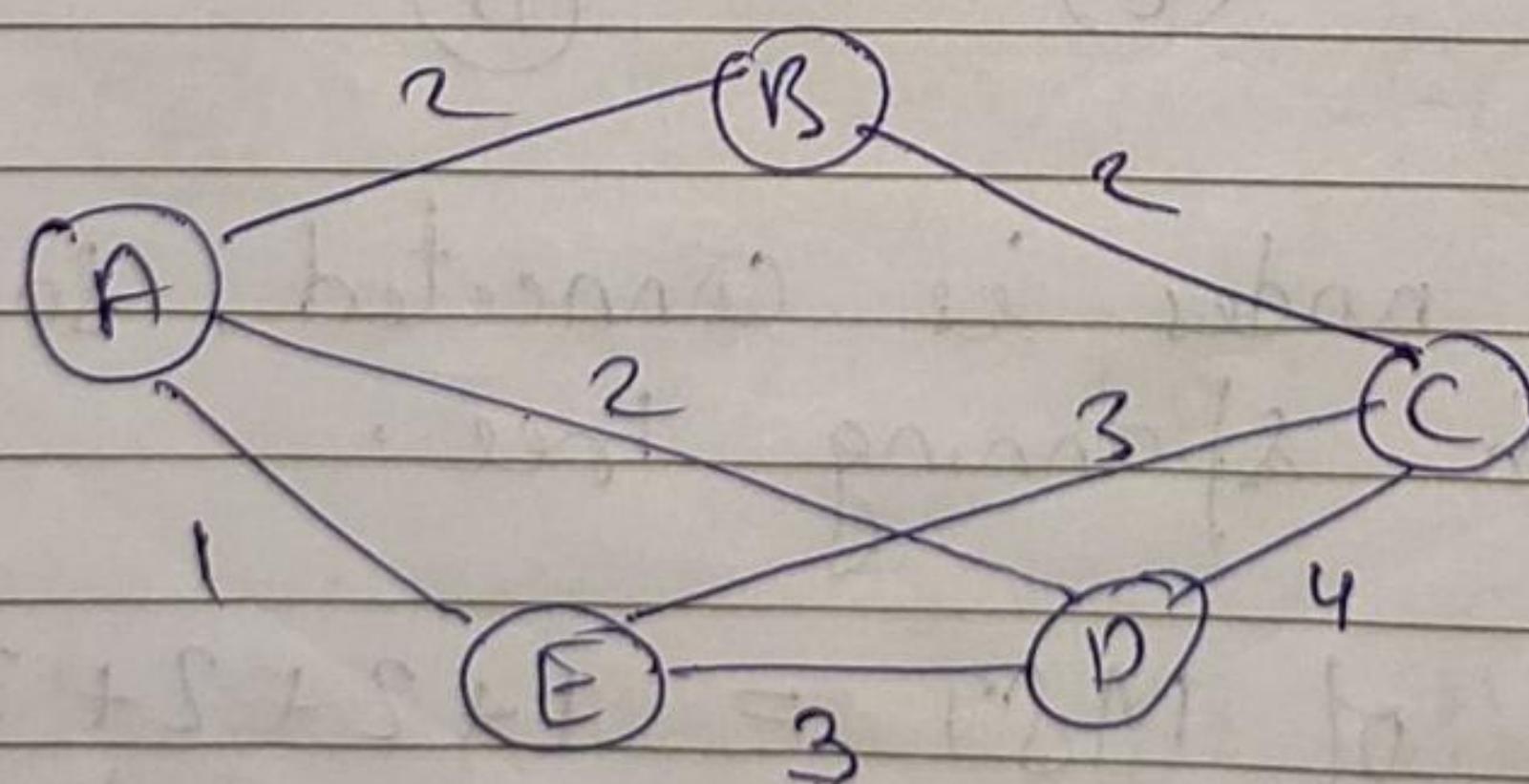
Kruskal's Algorithm for MST

Q. Solve following graph to find MST using Kruskal's Algorithm.



Ans → [Note → I will show better solution which we will write in exam only for this question]

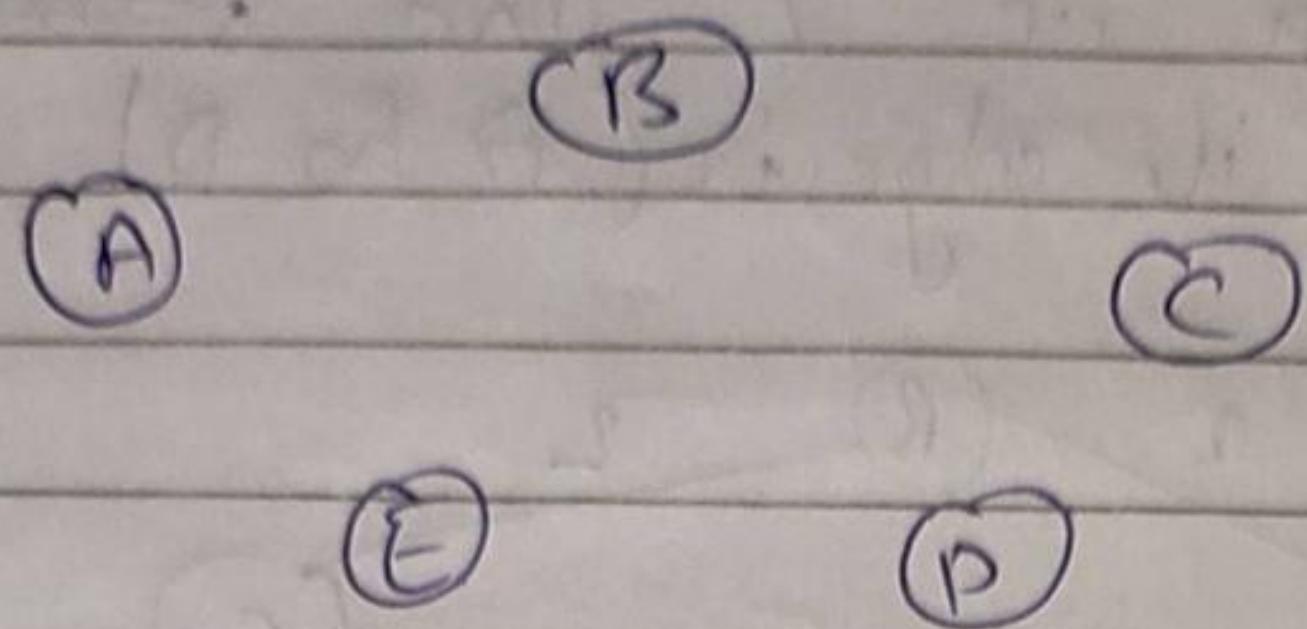
Step 1 :- Remove all the alternative edge between two nodes (if available) and keep edge with minimum weight).



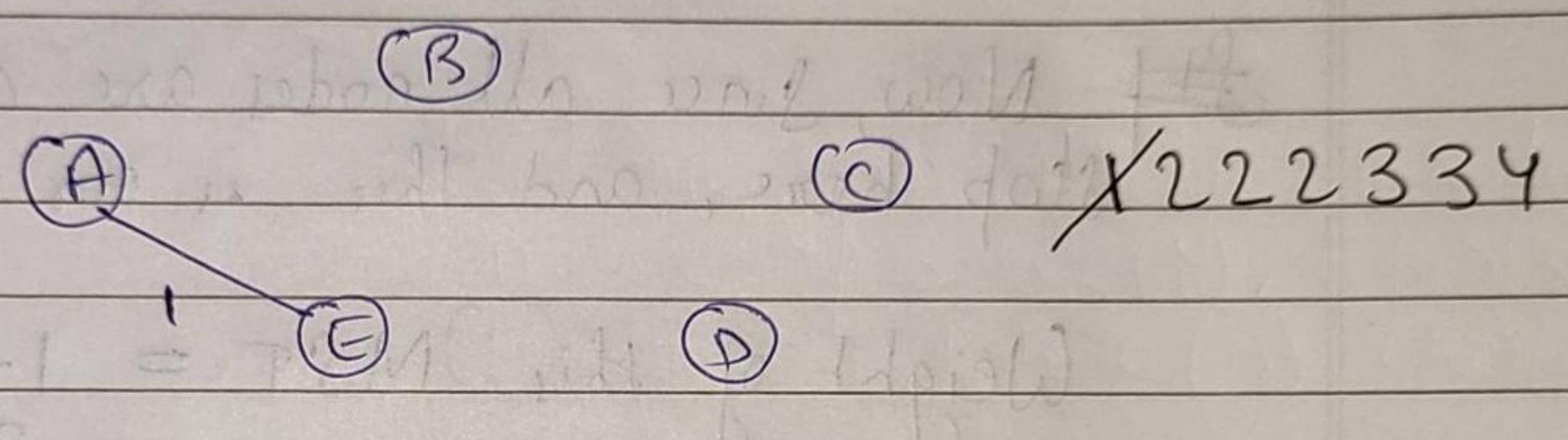
Step 2 :- Arrange all the weight in ascending order

1 2 2 2 3 3 4.

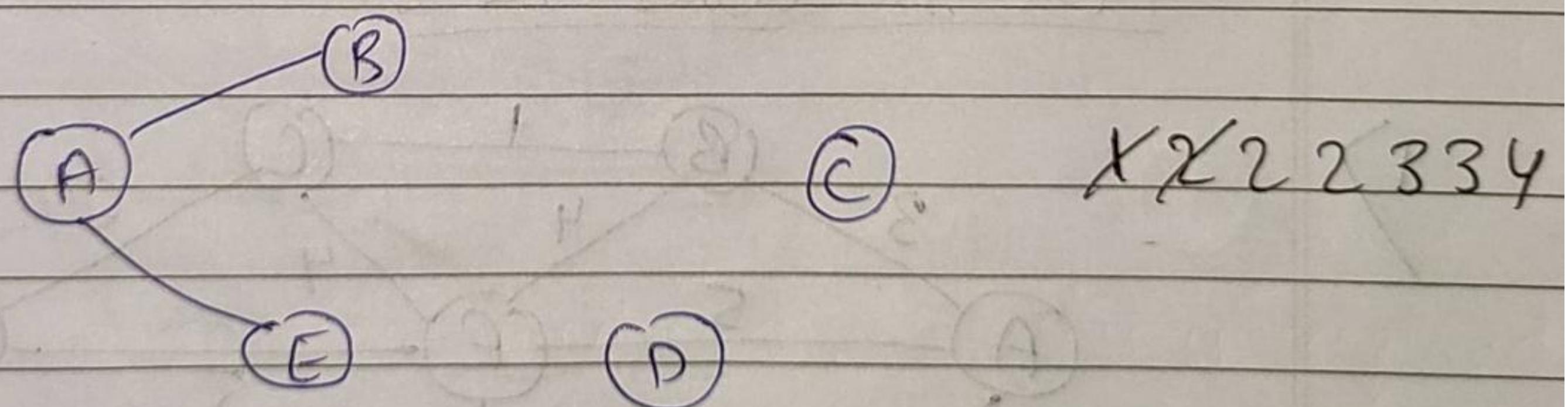
Step 3 :- Visit all node in without any connection



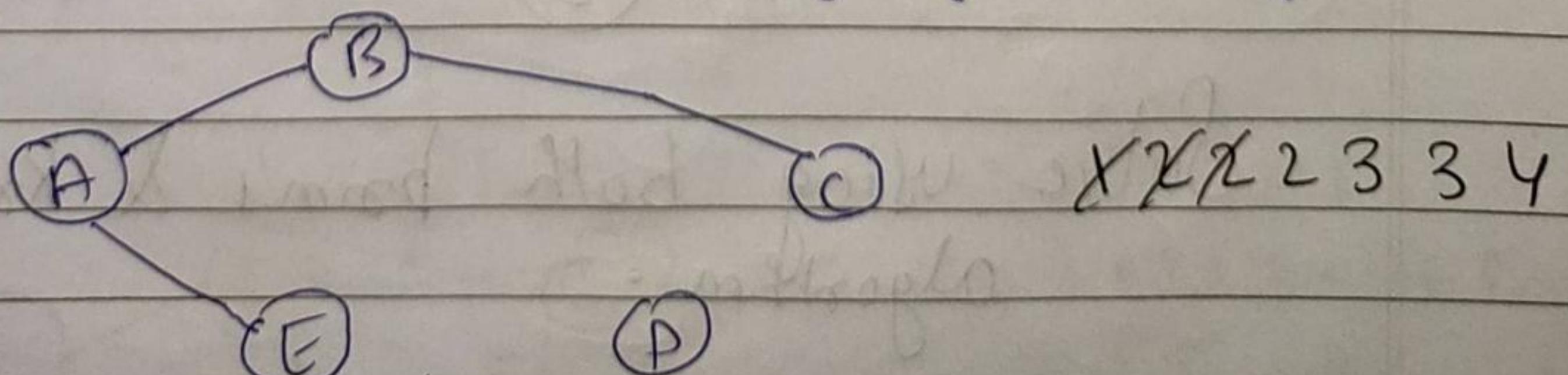
Step 4 :- Select 1 from ascending order and connect node with weight of 1 (ie A to E)



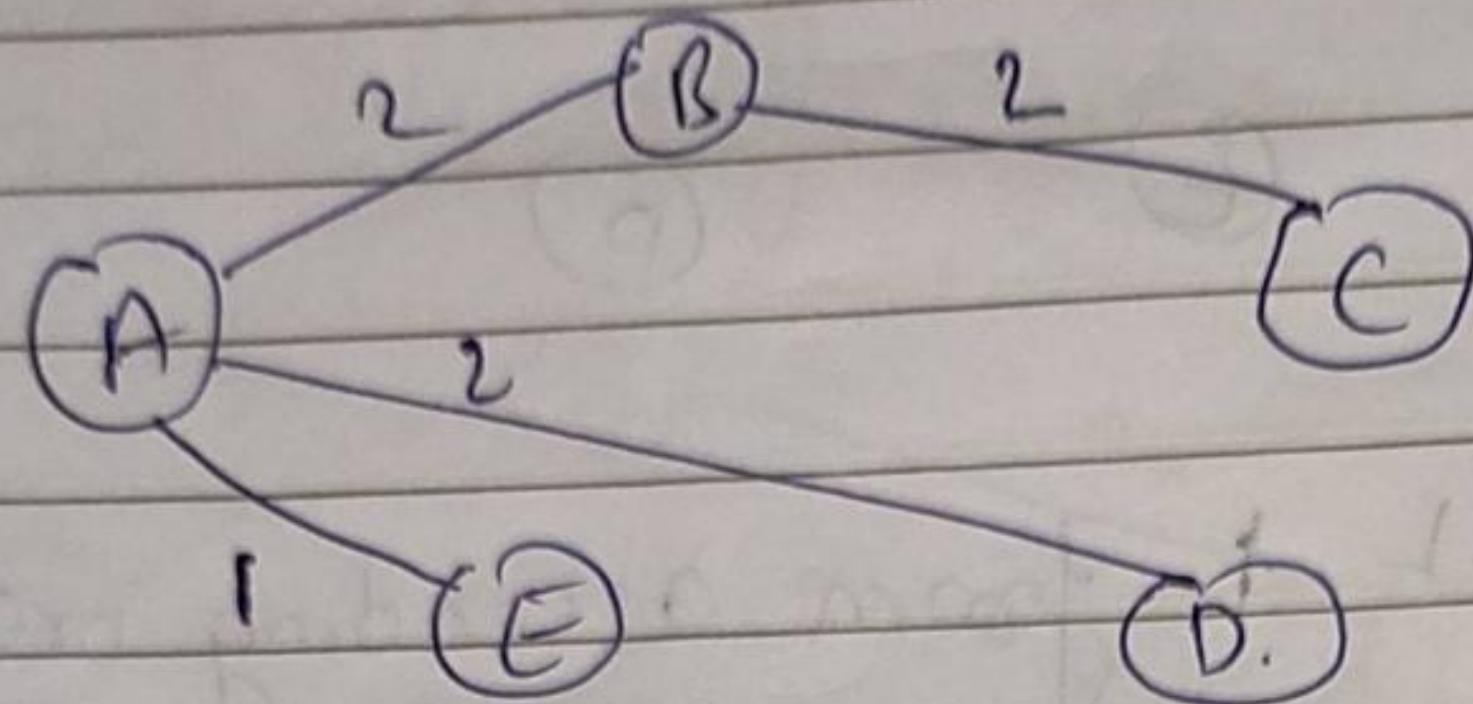
Step 5 :- Now, select next number from ascending order i.e. 2 and connect node with that weight i.e. (A to B)



Step 6 :- Now, select next ascending order number i.e 2 and connect edge of this weight (B to C)



Step 7 :- Now, select next ascending order number i.e. 2 and select connect node with it edge i.e. (A to D)

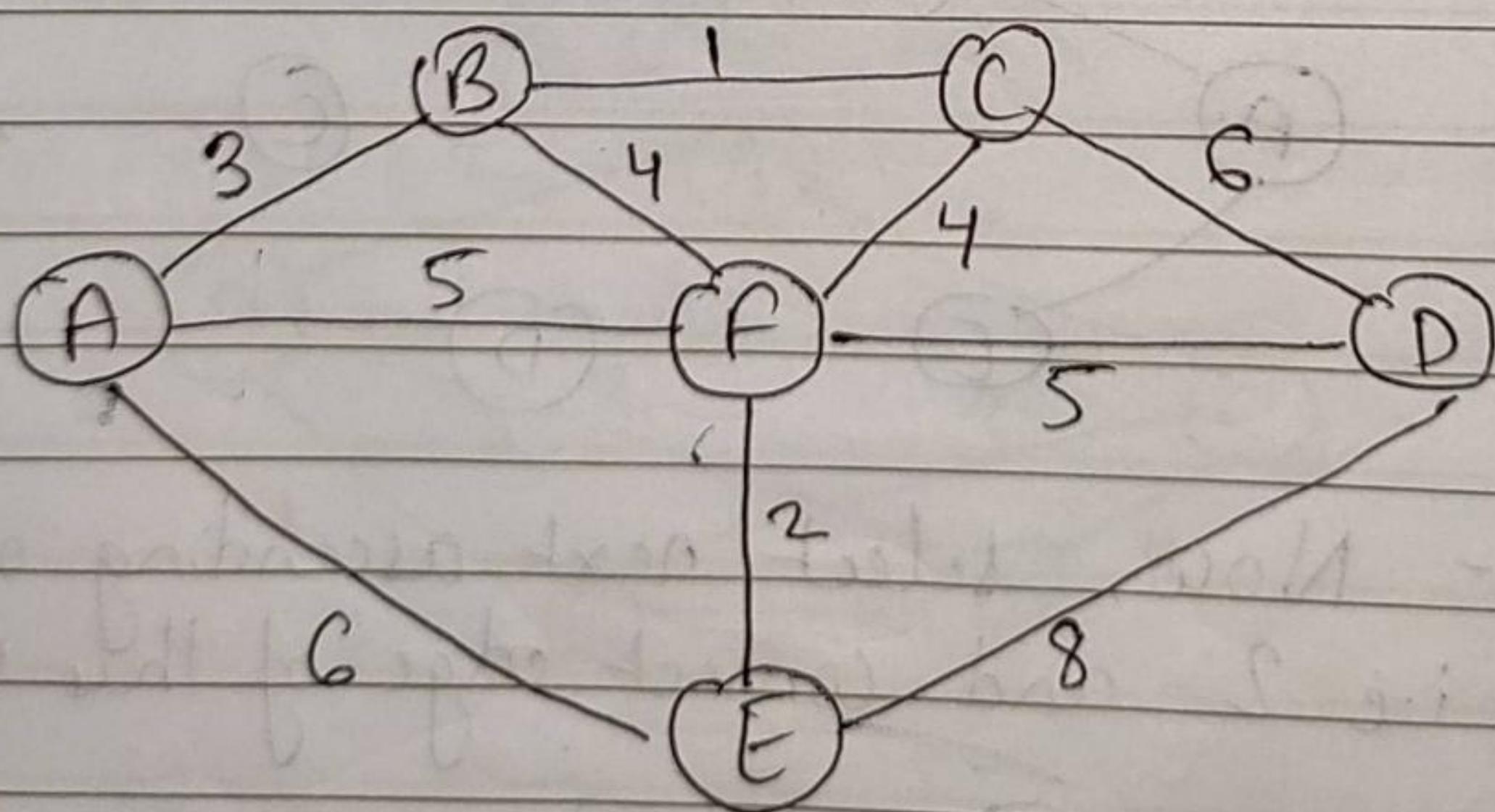


~~Step~~ Now, since all nodes are connected, we stop here, and this is our required MST.

$$\text{Weight of this MST} = 1 + 2 + 2 + 2 \\ = 7.$$

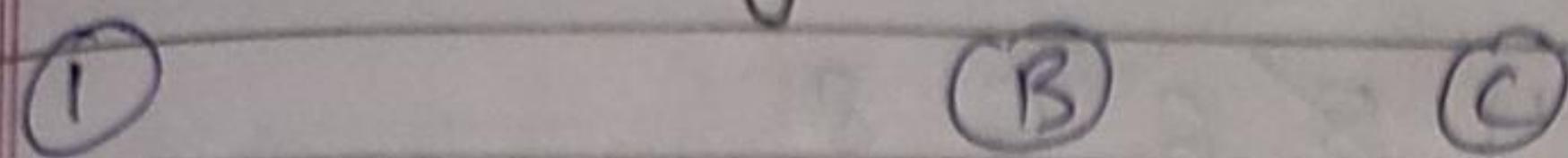
Practise Questions :-

1>

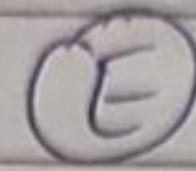
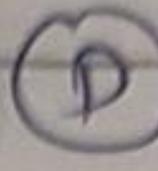


Solve using both Prim's & Kruskal's algorithm.

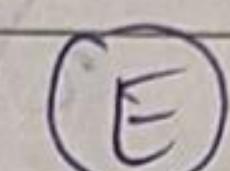
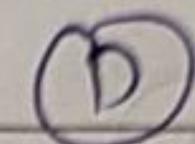
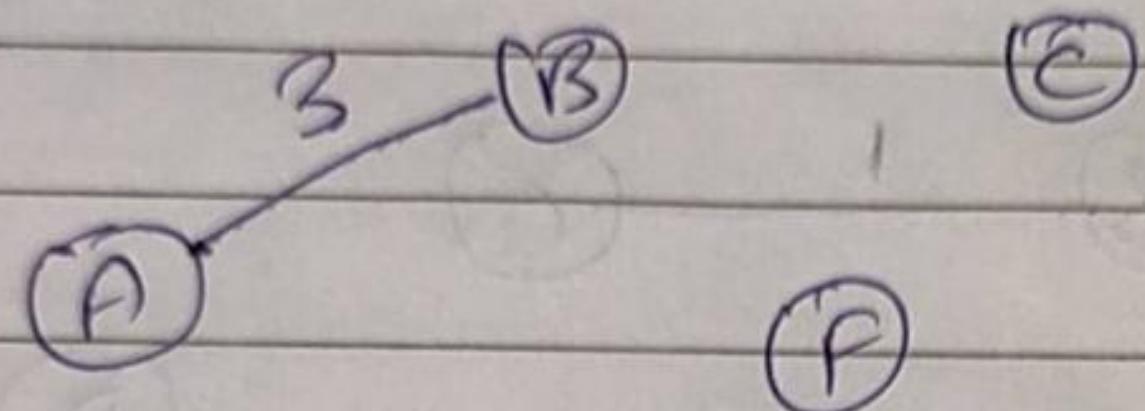
Sol → Using prim's



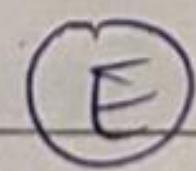
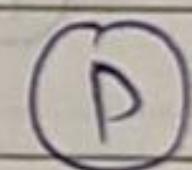
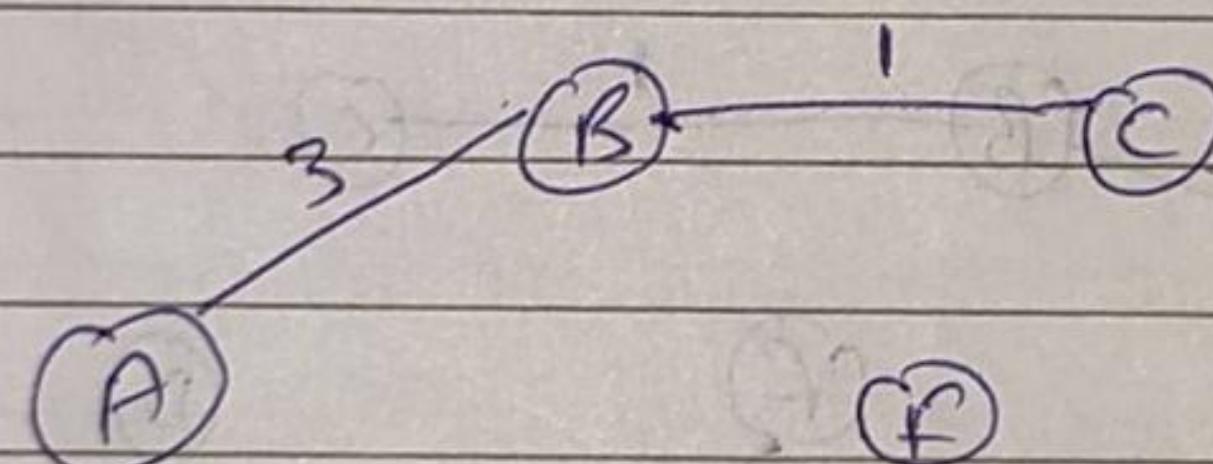
fixed → A



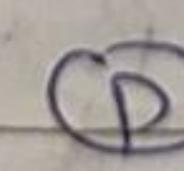
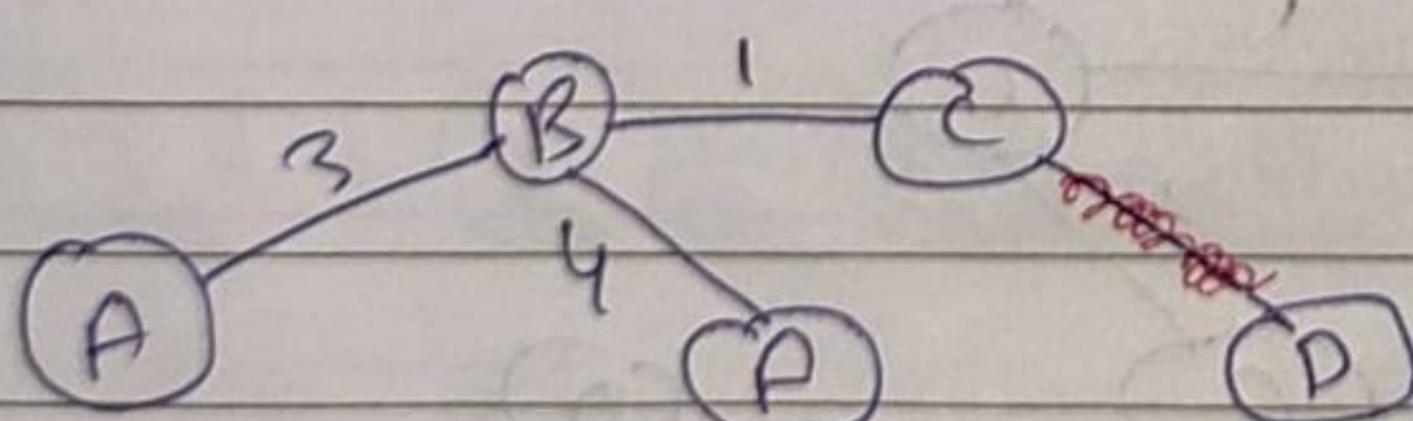
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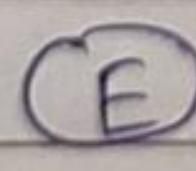
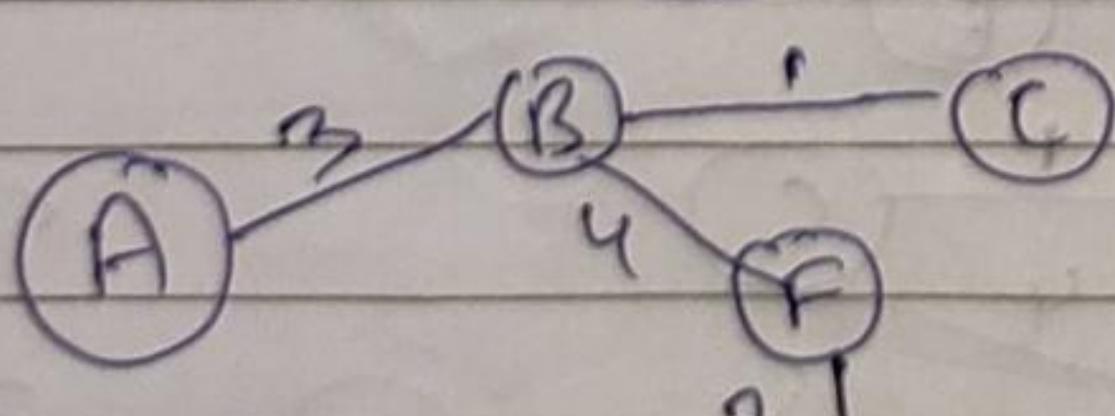
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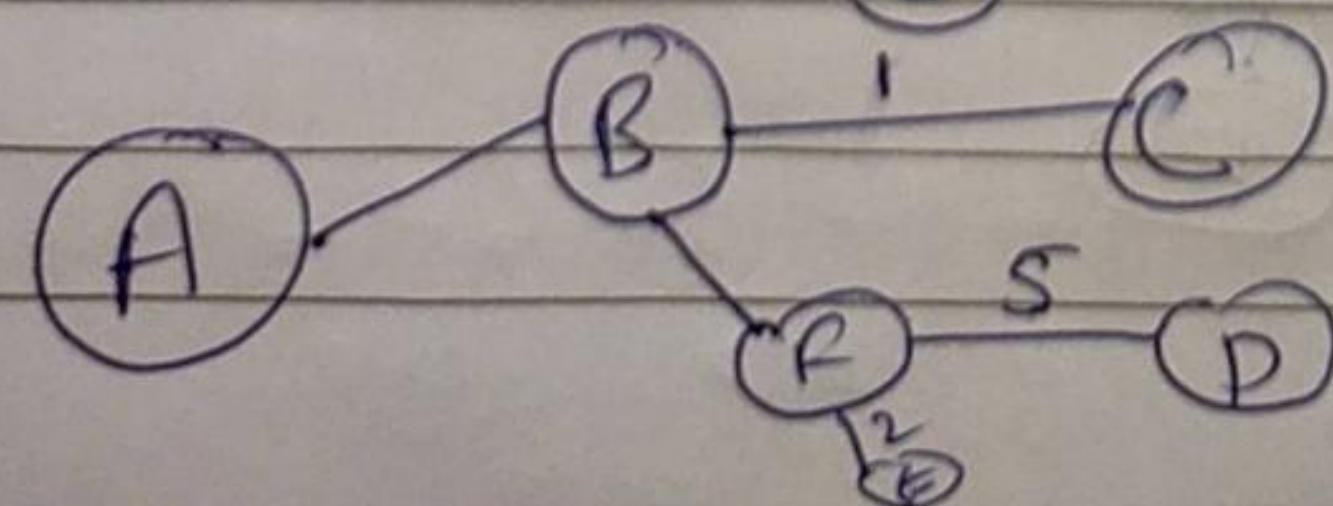
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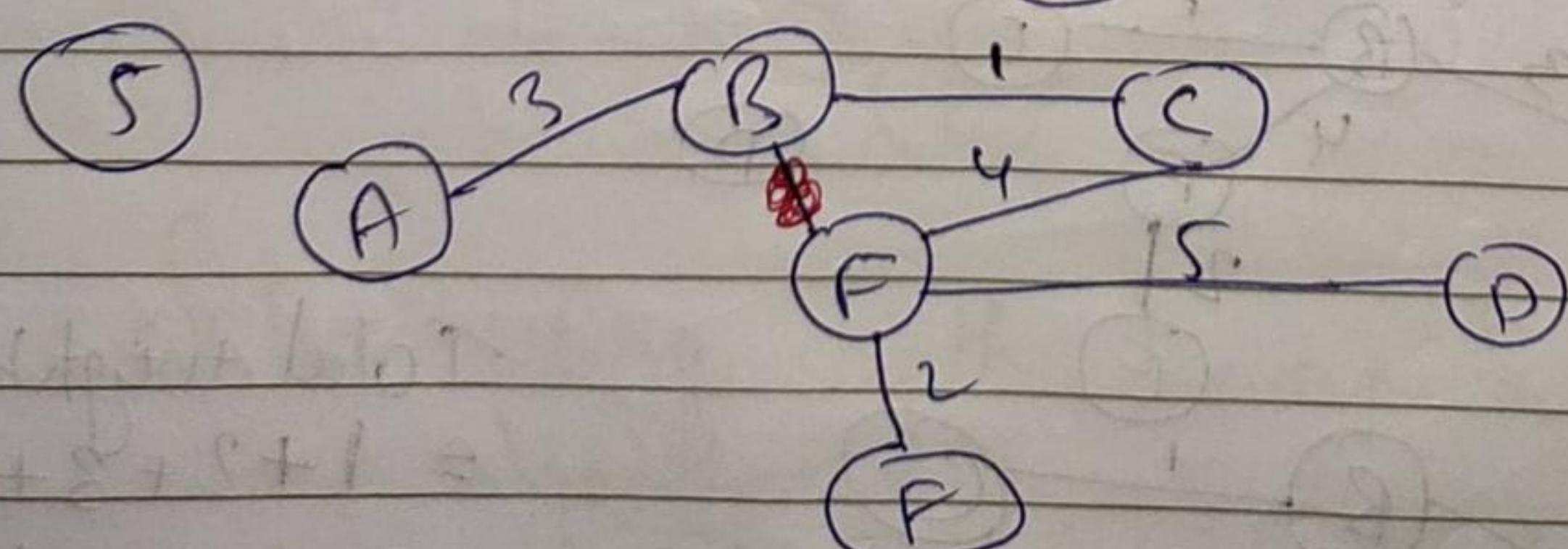
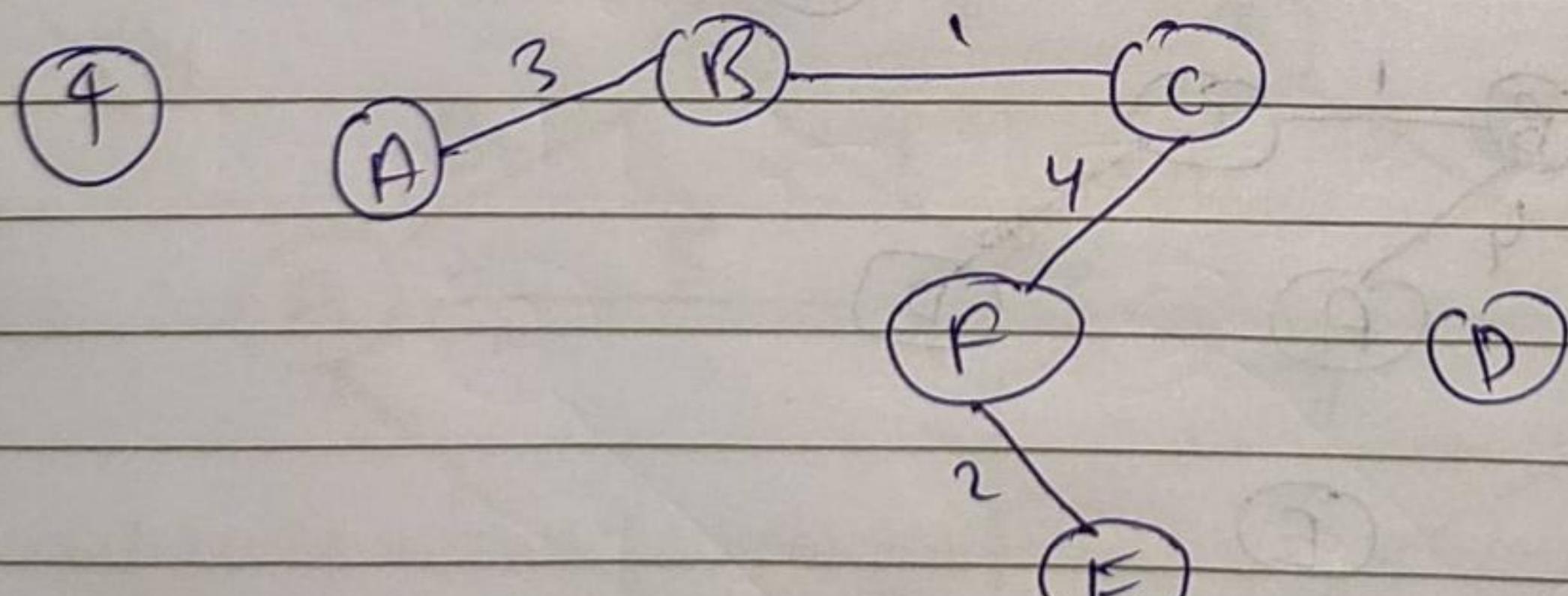
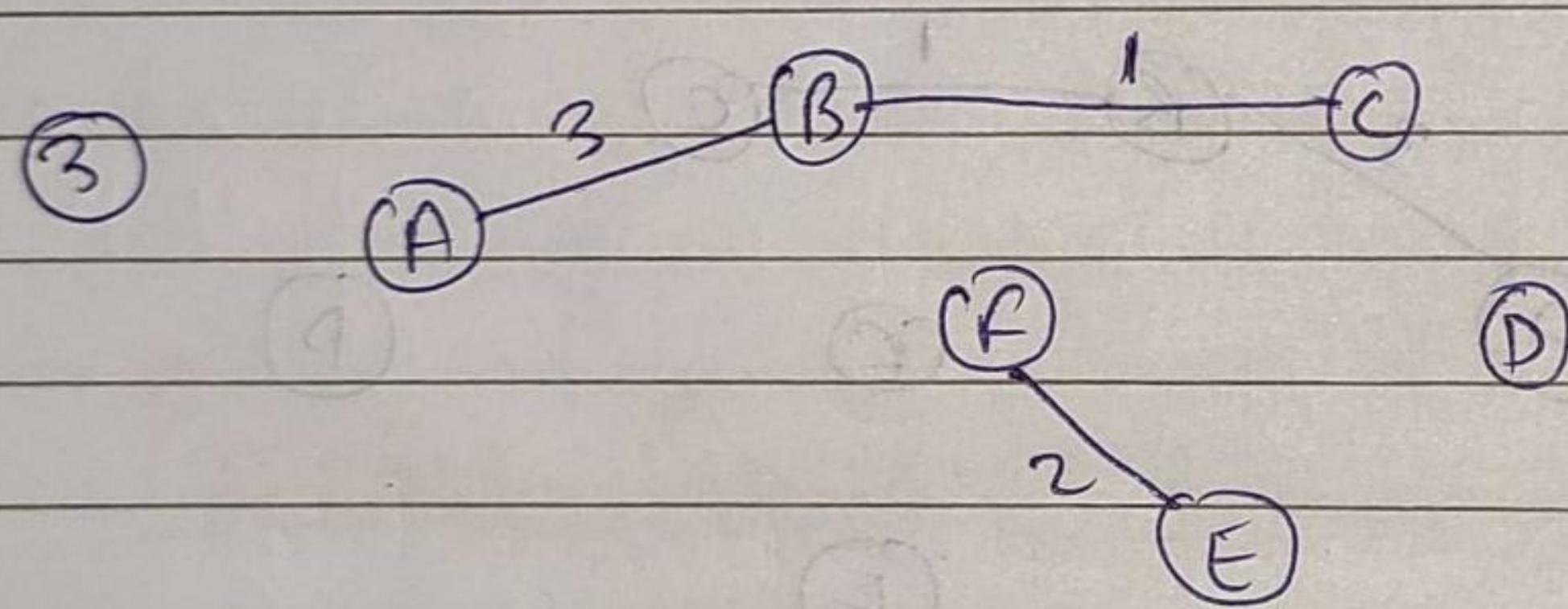
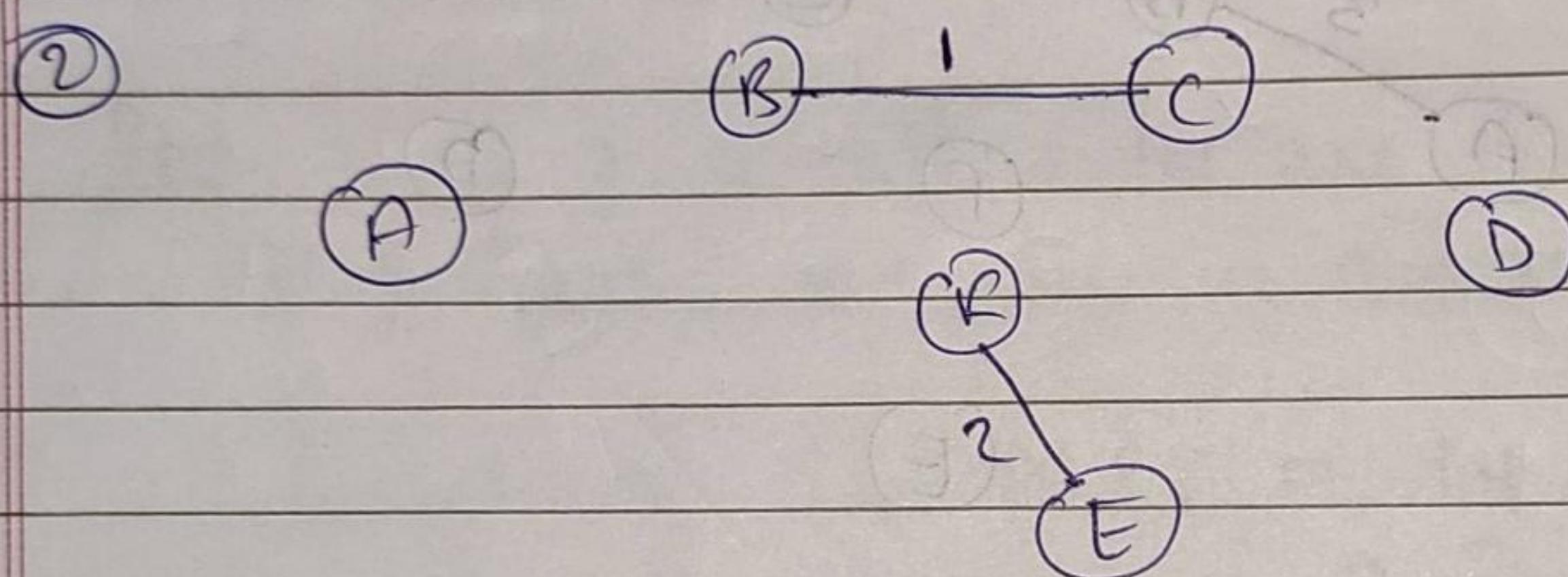
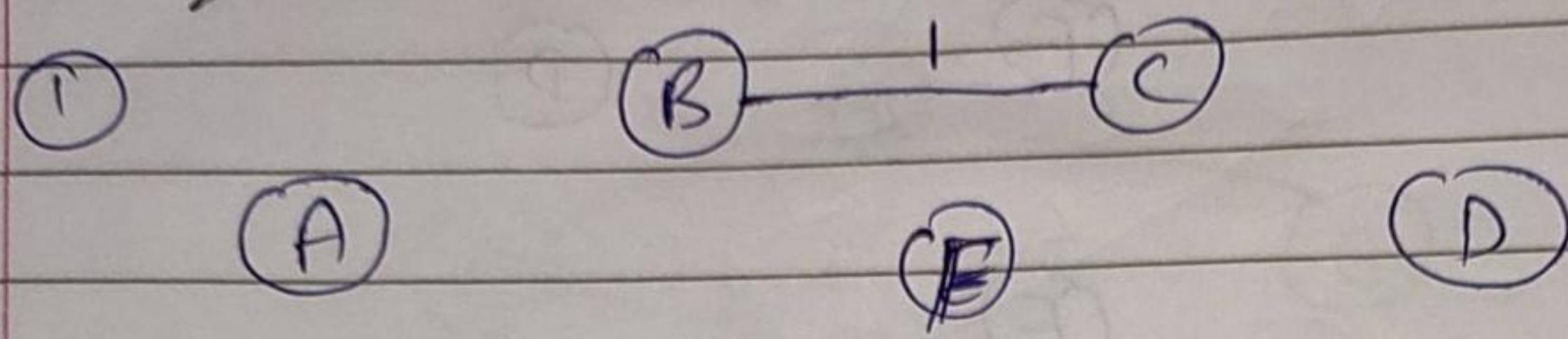


$$\begin{aligned} \text{Total weight} \\ = 1 + 2 + 3 + 4 + 5 \\ = 15 \end{aligned}$$

Ans

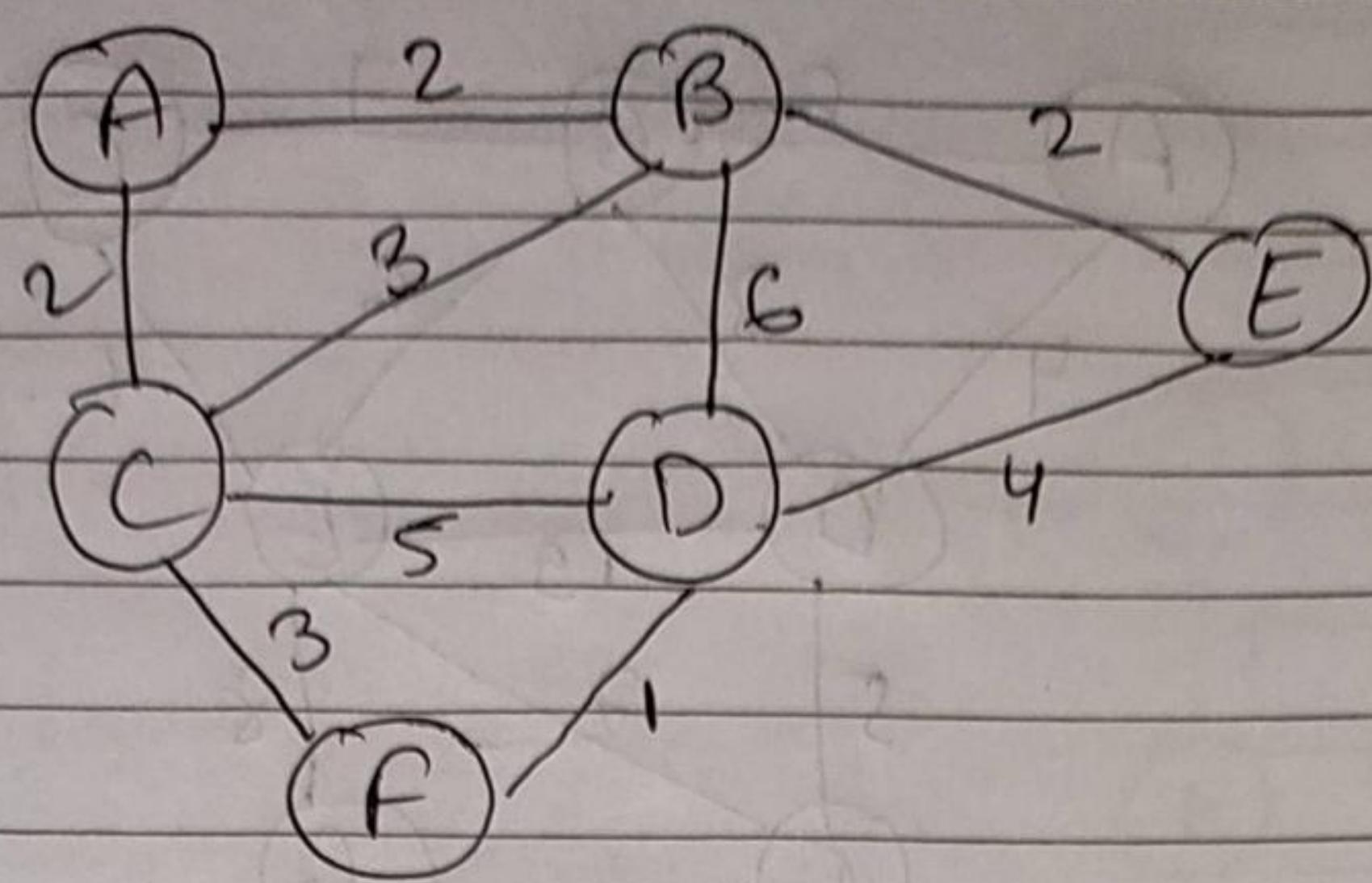
Using Kruskal's :-

X X 3 4 4 5 6 6 8

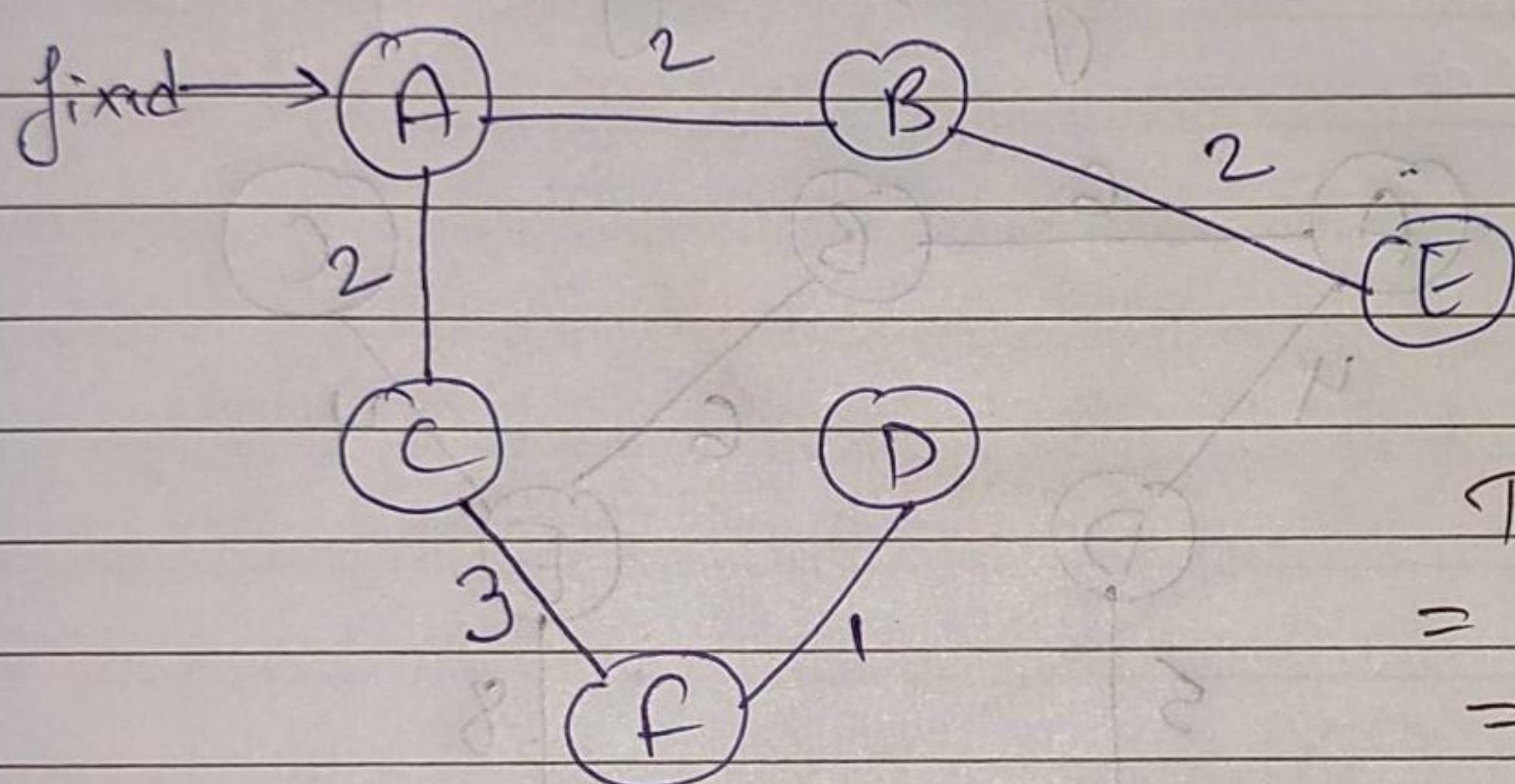


$$\begin{aligned} \text{Total weight} \\ = 1 + 2 + 3 + 4 + 5 \\ = 15 \end{aligned}$$

Q.2

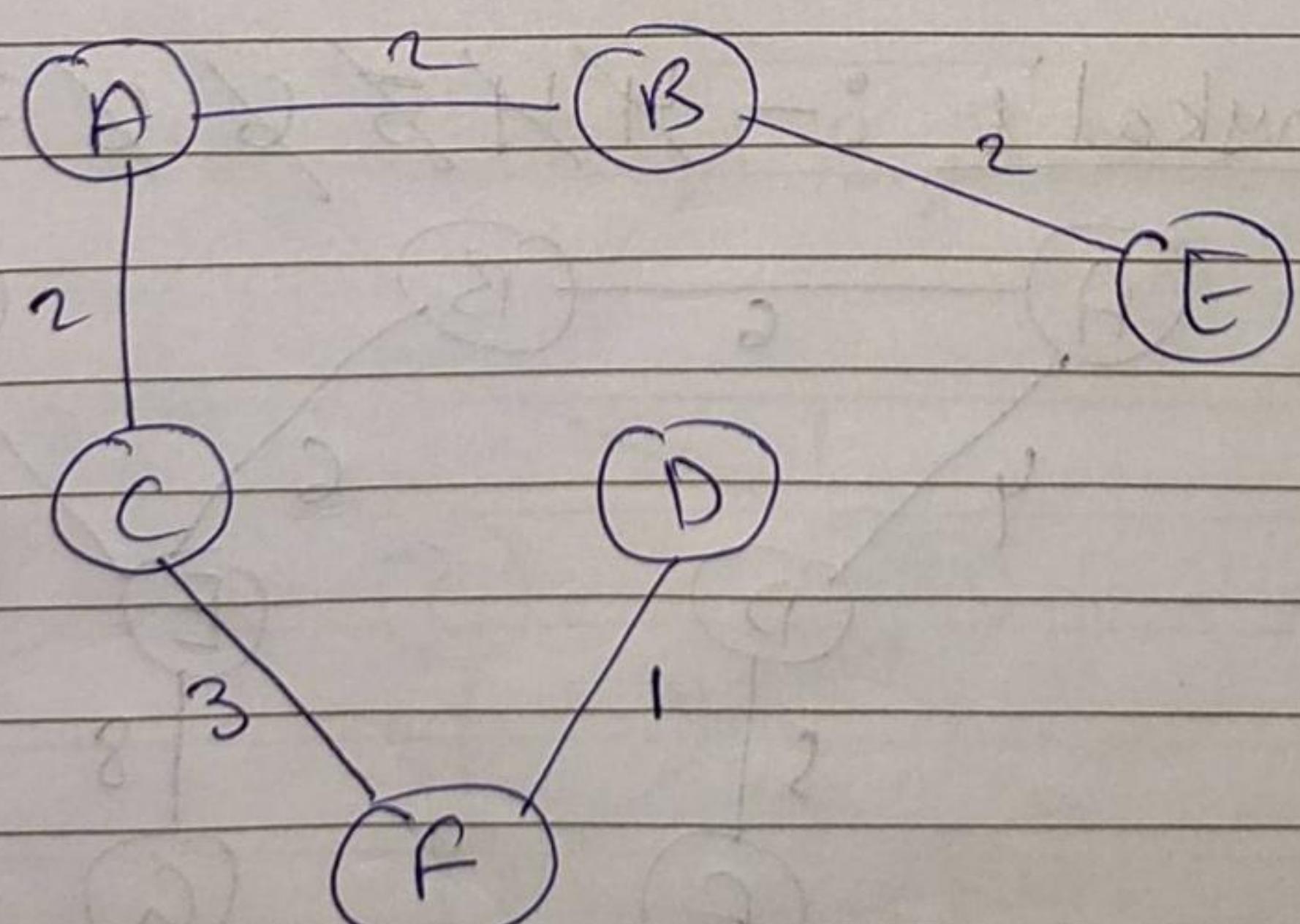


Sol → Prim :-

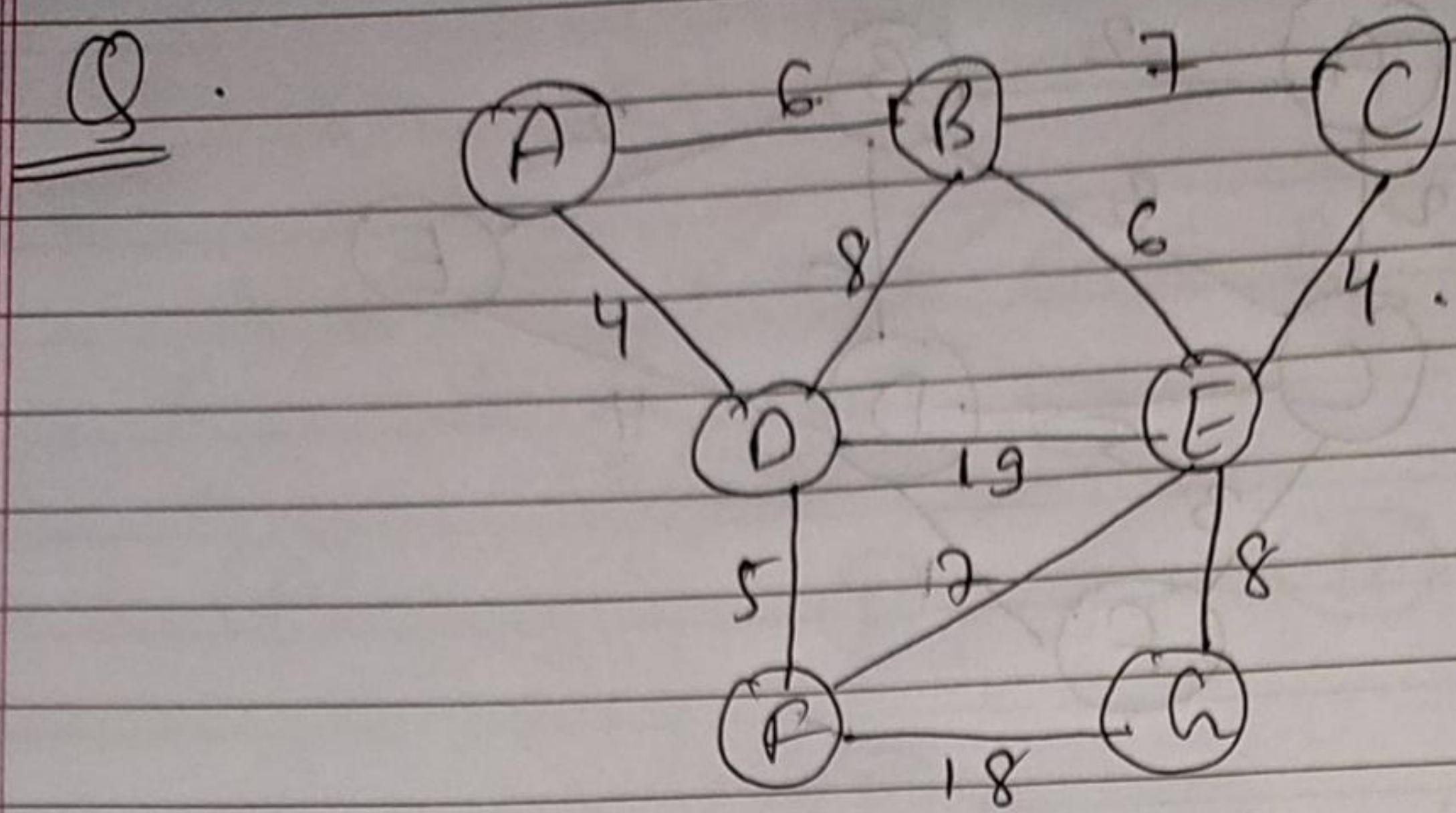


$$\begin{aligned}
 \text{Total weight} &= 1 + 2 + 2 + 2 + 3 \\
 &= 10 \quad \underline{\text{Ans}}
 \end{aligned}$$

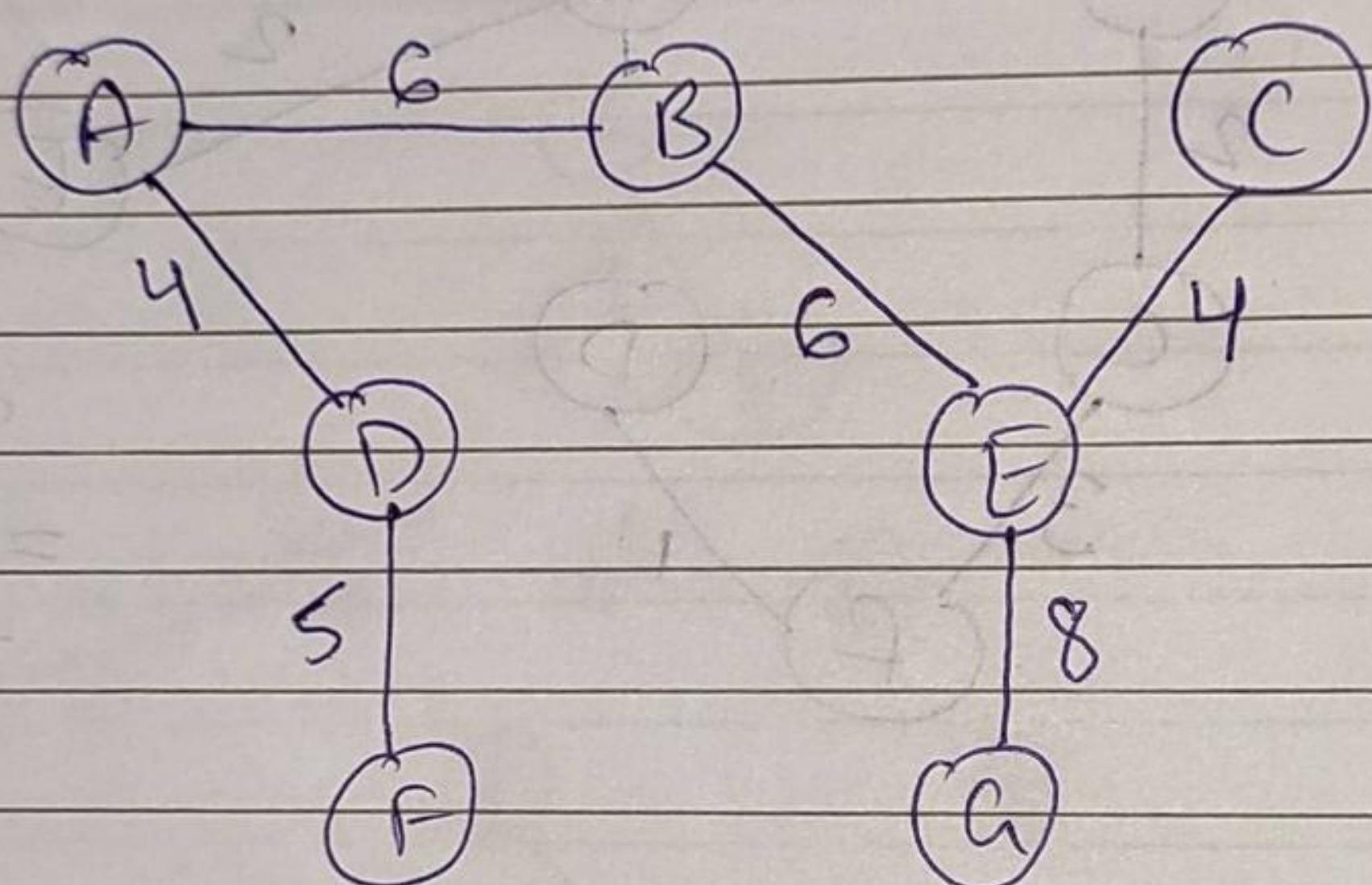
Kruskal's :- X 2 2 2 3 4 5 6



$$\begin{aligned}
 \text{Total weight} &= 1 + 2 + 2 + 2 + 3 \\
 &= 10 \quad \underline{\text{Ans}}
 \end{aligned}$$

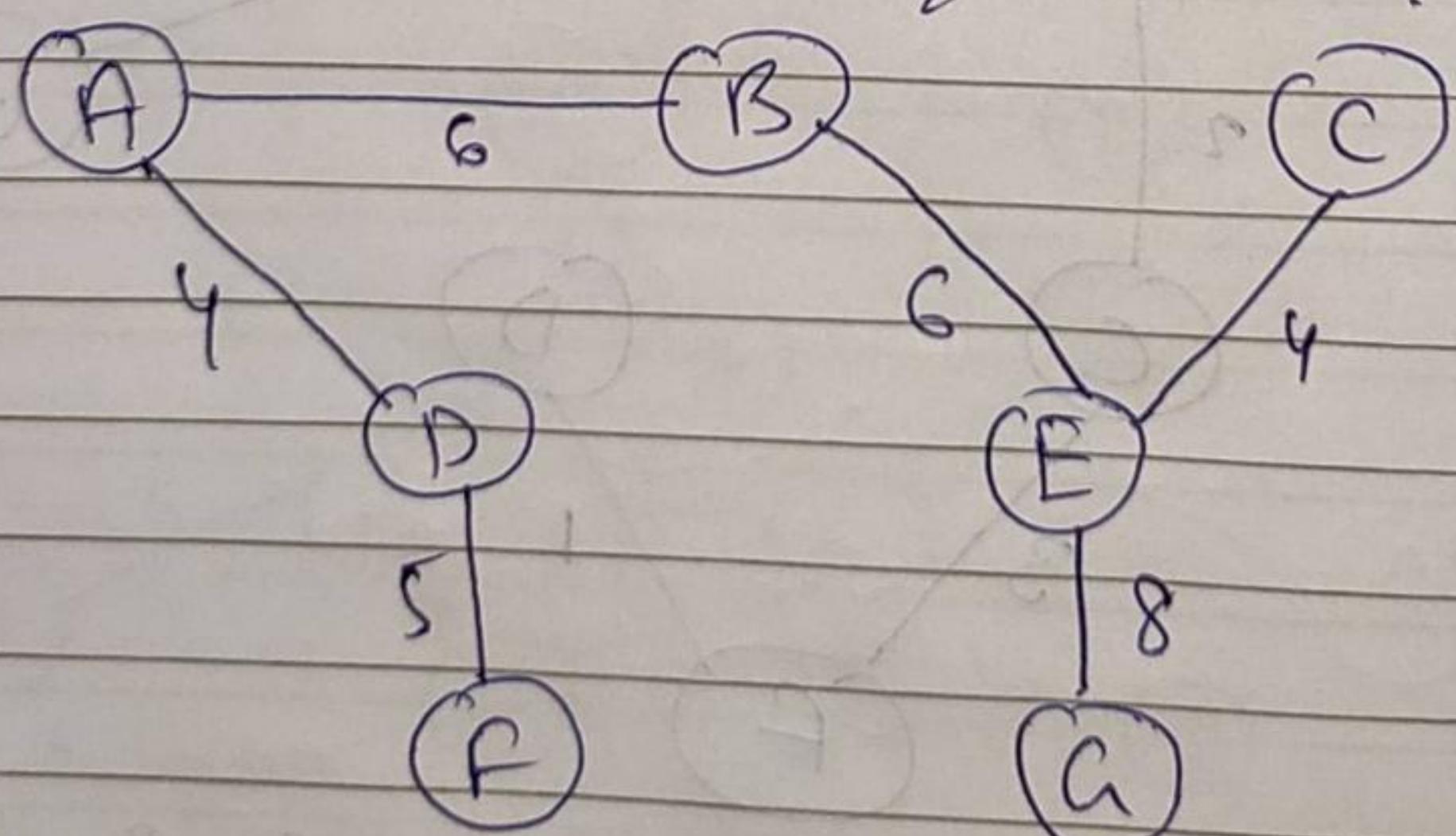


Sol → Prim's using D as fixed point.

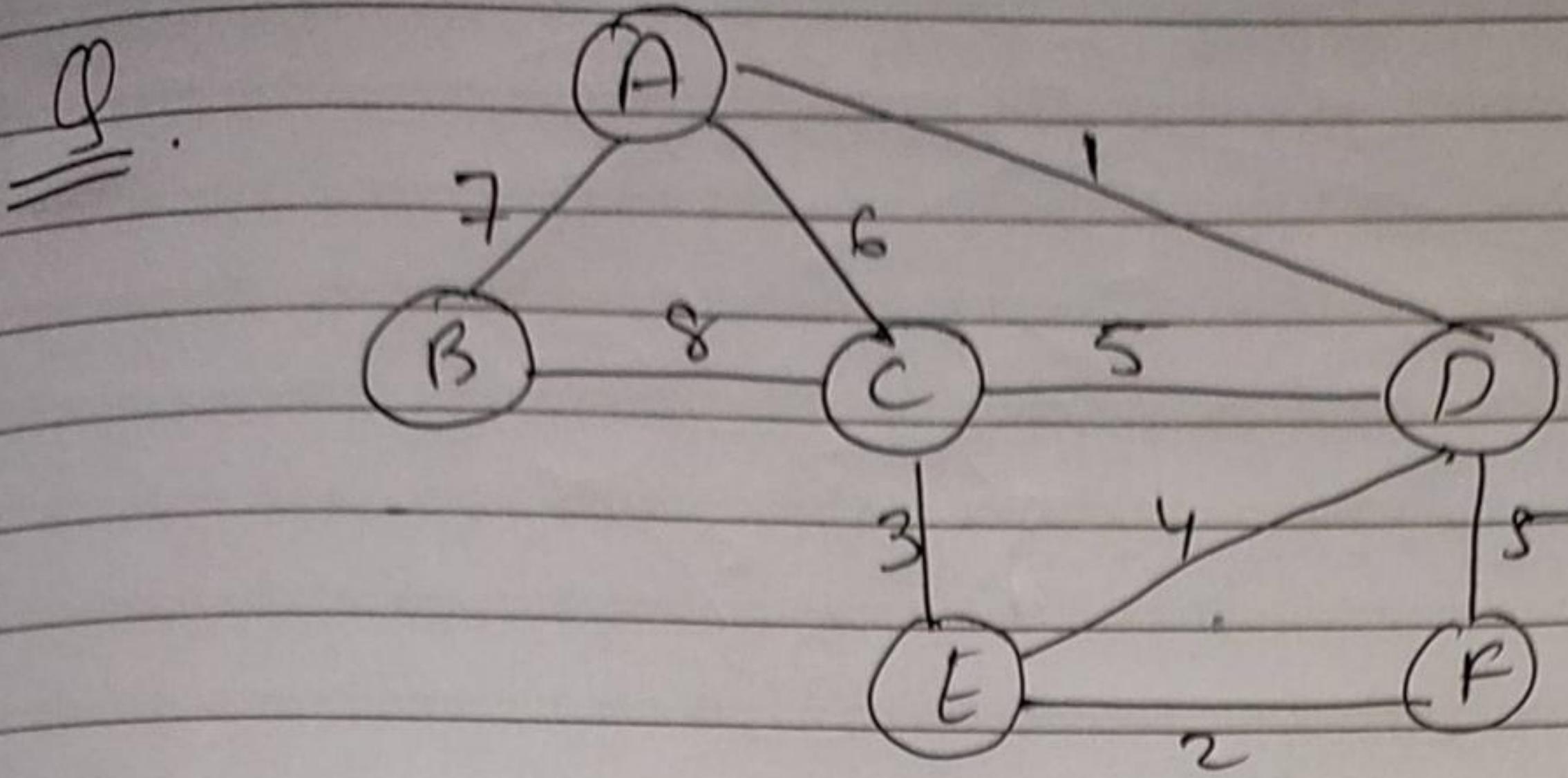


$$\text{Total weight} = 4 + 5 + 4 + 6 + 6 + 8 = 33.$$

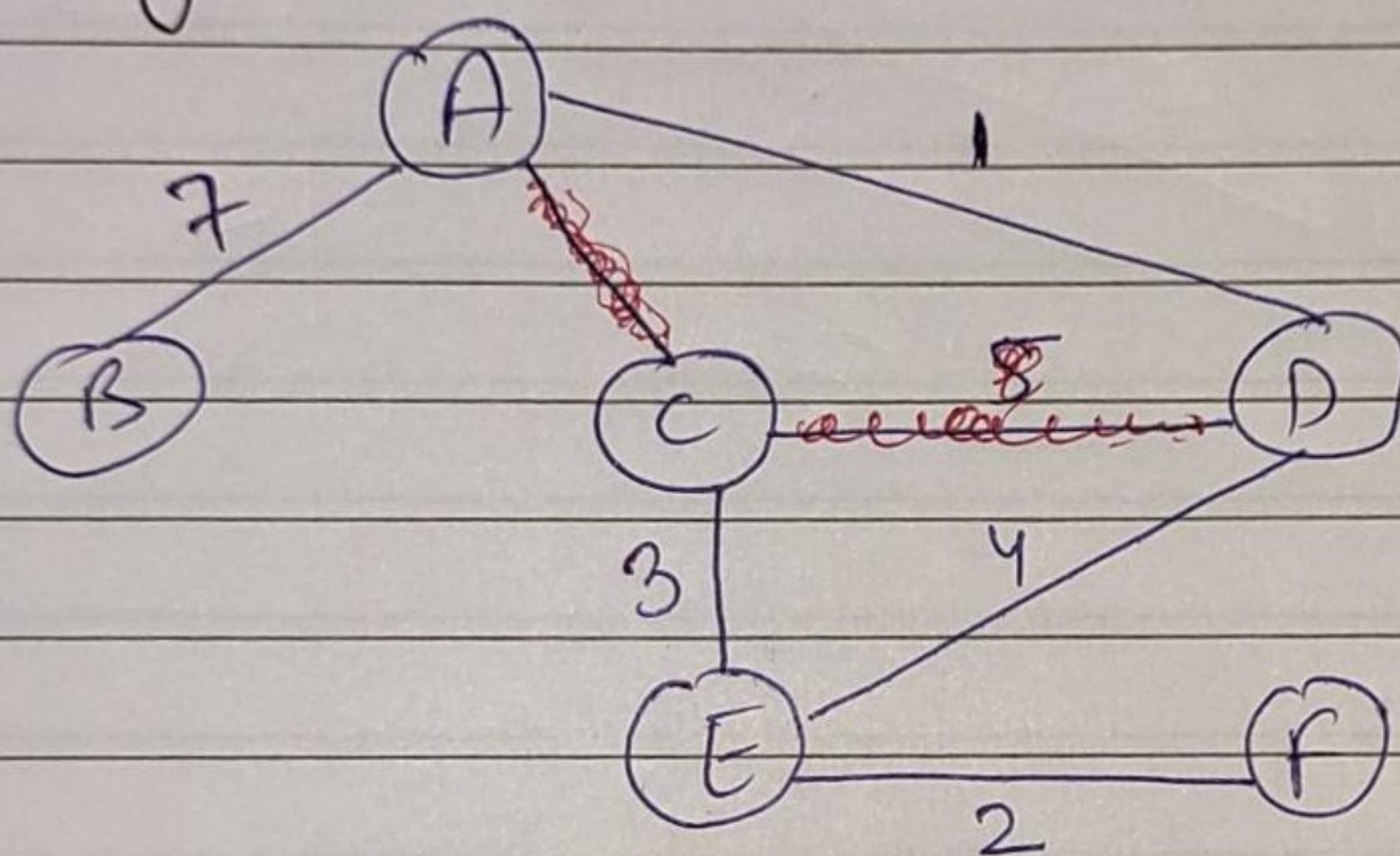
Kruskal's :- ~~4 4 5 6 6 7 7 8 8 18 19~~



$$\begin{aligned}\text{Total weight} &= 4 + 4 + 5 + 6 + 6 + 8 \\ &= 33\end{aligned}$$

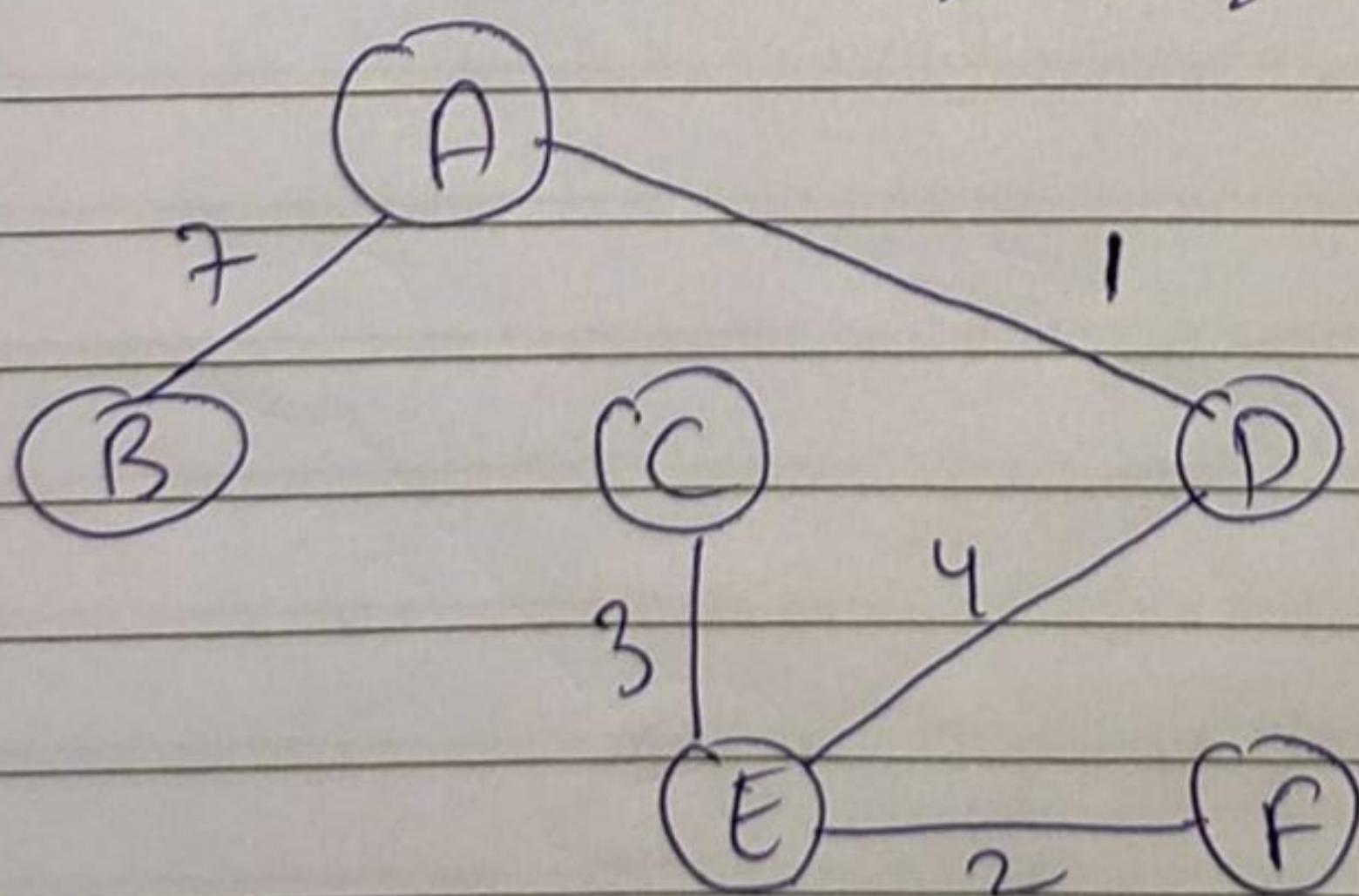


Sol → Using Prim's :-



$$\text{Total weight} = 1 + 2 + 3 + 4 + 7 = 17 \text{ Ans}$$

Using Kruskal's :- X 2 3 4 5 5 6 ≠ 8



$$\text{Total weight} = 1 + 2 + 3 + 4 + 7 = 17 \text{ Ans}$$

Dynamic Programming

- * It is similar to divide & conquer
the difference is that in this we store the value of subproblem solution in a table to use it again in future. It follows Principle of optimality.
- * Dynamic programming applies when the subproblem overlaps.

4 Steps :-

- * Characterize the structure of an optimal solution.
- * Recursively define the value of an optimal solution.
- * Compute the value of an optimal solution (in bottom up fashion).
- * Construct optimal solution from computed information.

Examples :-

- 1) 0/1 Knapsack
- 2) Matrix chain Multiplication
- 3) Longest Common Subsequence
- 4) Optimal Binary Search Tree.

1) 0/1 knapsack :-

It is like fractional knapsack. Difference between the two is that in this either we take entire or take nothing.

Q. Given knapsack capacity = 5 kg.

Item	Weight	Value
I ₁	2	3
I ₂	3	4
I ₃	4	5
I ₄	5	6

Ans →

weight →
0 1 2 3 4 5

		0	1	2	3	4	5
		0	0	0	0	0	0
Items ↓	1	0	0	3	3	3	3
	2	0	0	3	4	4	7
3	0	0	3	4	5	7	
4	0	0	3	4	5	7	

weight of
2 & 3 = 5

value of
= 3 + 4
= 7

⇒ Maximum Value = 7

Items I & II are involved.

$$V[i, w] = \max\{V[i-1, w], V[i-1, w - w[i]] + P[i]\}$$

Q.	Item	Weight	Values
	I ₁	2	1
	I ₂	3	2
	I ₃	4	5
	I ₄	5	6

Knapsack Capacity = 8

Sol →

	0	1	2	3	4	5	6	7	8
0	0	0	0	0	0	0	0	0	0
1	0	0	1	2	3	1	1	1	1
2	0	0	1	2	2	3	3	3	3
3	0	0	1	2	5	5	6	7	7
4	0	0	1	2	5	6	6	7	8

Maximum value = 8.

Items involved → 2 & 4.

Using formula: ↓

$$v[i, w] = \max \{ v[i-1, w], v[i-1, w - w[i]] + p[i] \}$$

$$v[4, 4] = \max \{ v[3, 4], v[3, 4 - 5] + 6 \}$$

$$= \max \{ 5, 0 + 6 \}$$

$$= 6$$

Q for practice :-

Item	Weight	Value
1	2	20
2	4	25
3	8	60

Knapsack capacity = 12 kg

Item	1	2	3	4
1	2	3	3	3
2	3	3	7	7
3	4	4	2	2
4	5	5	9	9

Capacity = 5 kg

Longest Common Subsequence (LCS)

Longest Common Subsequence is a sequence that appears in the same relative order but not necessarily contiguous ~~that~~ (not substring) in both the string. i.e. element is not required to occupy consecutive position within original sequences.

Q

$$x = \langle A, B, C, D, B \rangle$$

$$y = \langle B, D, C, B \rangle$$

find the LCS of these two string.

y_i	B	D	C	B	
x_i	0	0	0	0	0
B	0	1 ↙	←1	←1	1 ↗
A	0	↑1	↑1	↑1	↑1
C	0	↑1	↑1	↖2	←2
D	0	↑1	↖2	↑2	↑2
B	0	↖1	↑2	↑2	↖3

$\Rightarrow BCB$ Ans

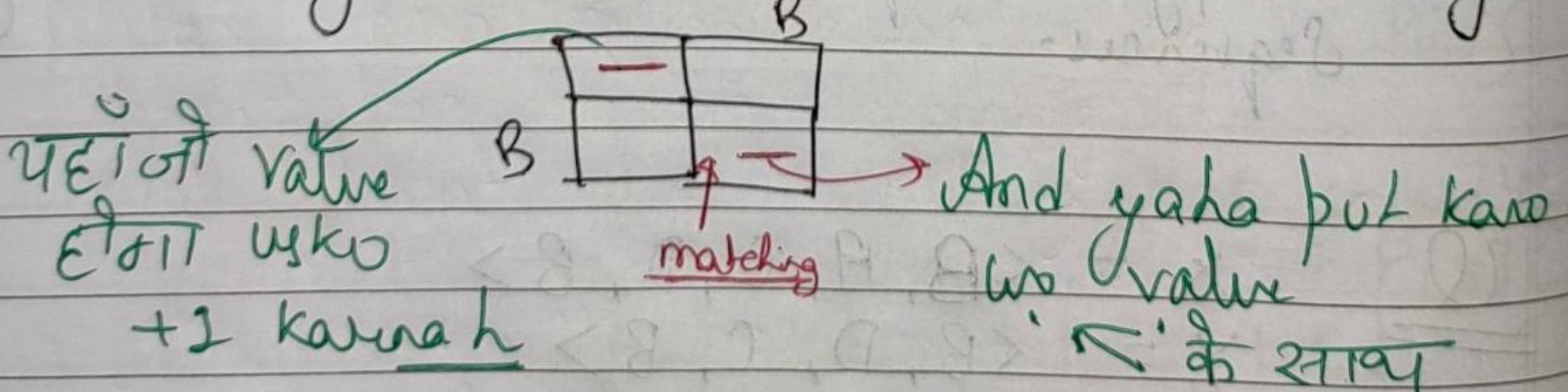
↑ how we select

सबसे Last से Start करेंगे and वहाँ
Arrow को Follow करेंगे।

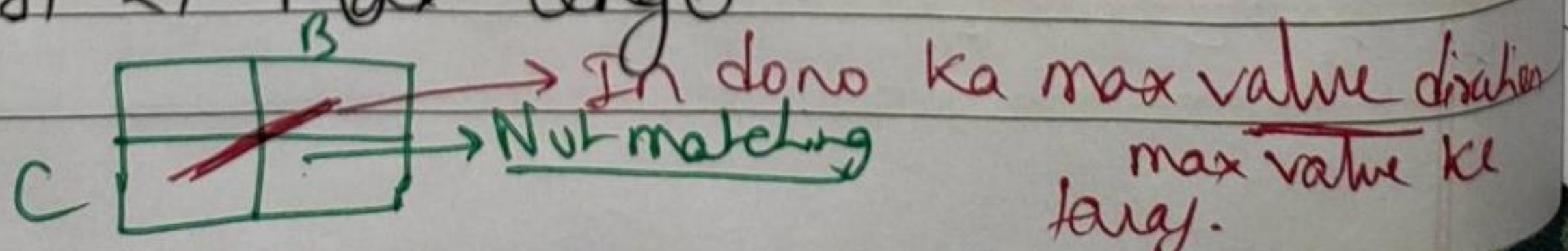
Arrow '↖' ताला होने पर Circle
करें।

How we are filling :-

* x_i wala ko y_i के बीच Compare
करें, If matching. Then
diagonal oki value me +1 Karenge.



* Match nahi to side & uppar tali
value में से Max lenge.



Q. $x = \langle A, B, C, B, D, A, B \rangle$
 $y = \langle B, D, C, A, B, A \rangle$.

Ans →

	<u>y: B</u>	D	<u>C</u>	A	<u>B</u>	<u>A</u>
<u>x:</u>	O	O	O	O	O	O
A	O	↑O	↑O	↑O	↖1	↖1
B	O	↖1	↖1	↖1	↖2	↖2
C	O	↑1	↑1	↖2	↖2	↑2
B	O	↖1	↑1	↑2	↖3	↖3
D	O	↑1	↖2	↑2	↑3	↑3
A	O	↑1	↑2	↑2	↖3	↖4
B	O	↖1	↑2	↑2	↑3	↑4

$\Rightarrow BCBA$ Ans

Algorithm :-

LCS-LENGTH (u, y)

1. $m \leftarrow \text{length}[u]$
2. $n \leftarrow \text{length}[y]$
3. for $i \leftarrow 1$ to m
4. do $c[i, 0] \leftarrow 0$
5. for $j \leftarrow 1$ to n
6. do $c[0, j] \leftarrow 0$
7. for $i \leftarrow 1$ to m
8. do for $j \leftarrow 1$ to n
9. do if $u_i = y_j$
10. then $c[i, j] \leftarrow c[i-1, j-1] + 1$
11. $b[i, j] \leftarrow "$ ↖"

12. else if $c[i-1, j] \geq c[j, j-1]$
13. then $c[i, j] \leftarrow c[i-1, j]$
14. $b[i, j] \leftarrow "↑"$
15. else $c[i, j] \leftarrow c[j, j-1]$
16. $b[i, j] \leftarrow "↖"$
17. return c & b .

PRINT_LCS (b, x, i, j)

1. if $i = 0$ or $j = 0$
2. then return
3. if $b[i, j] = "↖"$
4. then PRINT_LCS (b, x, i-1, j-1)
5. print x;
6. else if $b[i, j] = "↑"$
7. then PRINT_LCS (b, x, i-1, j)
8. else PRINT_LCS (b, x, i, j-1).

Matrix Chain Multiplication

Matrix chain multiplication is an optimization problem concerning the most efficient way to multiply a given sequence of matrices. The problem is not actually to perform multiplication but merely to decide the sequence of matrix multiplication involved.

Q Find the optimal parenthesis of a matrix multiplication whose sequence of dimensions is $\langle 5, 4, 6, 2, 7 \rangle$ i.e. the matrix are as follows.

$$A_1 (5 \times 4)$$

$$A_2 (4 \times 6)$$

$$A_3 (6 \times 2)$$

$$A_4 (2 \times 7)$$

$$\text{Soln} := 5, 4, 6, 2, 7$$

\Rightarrow 5 elements

\therefore No. of blocks = $5 - 1 = 4$. ($i \in 1 \text{ to } 4$)

1	2	3	4
0	120	88	158
0	48	104	2
0	84	3	
0	4		

1	2	3	4
0	1	1	3
0	2	3	2
0	3	3	3
0	4		

$$\begin{matrix} 5 \\ \downarrow \\ P_0 \end{matrix} \quad \begin{matrix} 4 \\ \downarrow \\ P_1 \end{matrix} \quad \begin{matrix} 6 \\ \downarrow \\ P_2 \end{matrix} \quad \begin{matrix} 2 \\ \downarrow \\ P_3 \end{matrix} \quad \begin{matrix} 7 \\ \downarrow \\ P_4 \end{matrix}$$

$$m[i, j] = \min \{ m[i, k] + m[k+1, j] + P_{i-1} P_k P_j \}$$

where $i \leq k < j$

$$\begin{aligned} m[1, 2] &= \min [m[1, 1] + m[2, 2] + P_0 P_1 P_2] \\ &= \min [0 + 0 + 5 \cdot 4 \cdot 6] \\ &= 120 \end{aligned}$$

$$m[2,3] = \min [m[2,2] + m[3,3] + P_1 P_2 P_3]$$

$$= \min (0 + 0 + 4 \cdot 6 \cdot 2)$$

$$= 48$$

$$m[3,4] = \min [m[3,3] + m[4,4] + P_2 P_3 P_4]$$

$$= \min (0 + 0 + 6 \cdot 2 \cdot 7)$$

$$= 84$$

$$m[1,3] = \min \left\{ \begin{array}{l} m[1,1] + m[2,3] + P_0 \cdot P_1 \cdot P_3 \\ m[1,2] + m[3,3] + P_0 \cdot P_2 \cdot P_3 \end{array} \right.$$

$$\geq \min \left\{ \begin{array}{l} 0 + 48 + 5 \cdot 4 \cdot 2 \\ 120 + 0 + 5 \cdot 6 \cdot 2 \end{array} \right.$$

$$\geq \min (88, 180)$$

$$\geq 88 \text{ with } k=1$$

$$m[2,4] = \min \left\{ \begin{array}{l} m[2,2] + m[3,4] + P_1 P_2 P_4 \\ m[2,3] + m[4,4] + P_1 P_3 P_4 \end{array} \right.$$

$$\geq \min \left\{ \begin{array}{l} 0 + 84 + 4 \cdot 6 \cdot 7 \\ 48 + 0 + 4 \cdot 2 \cdot 7 \end{array} \right.$$

$$\geq \min (252, 104)$$

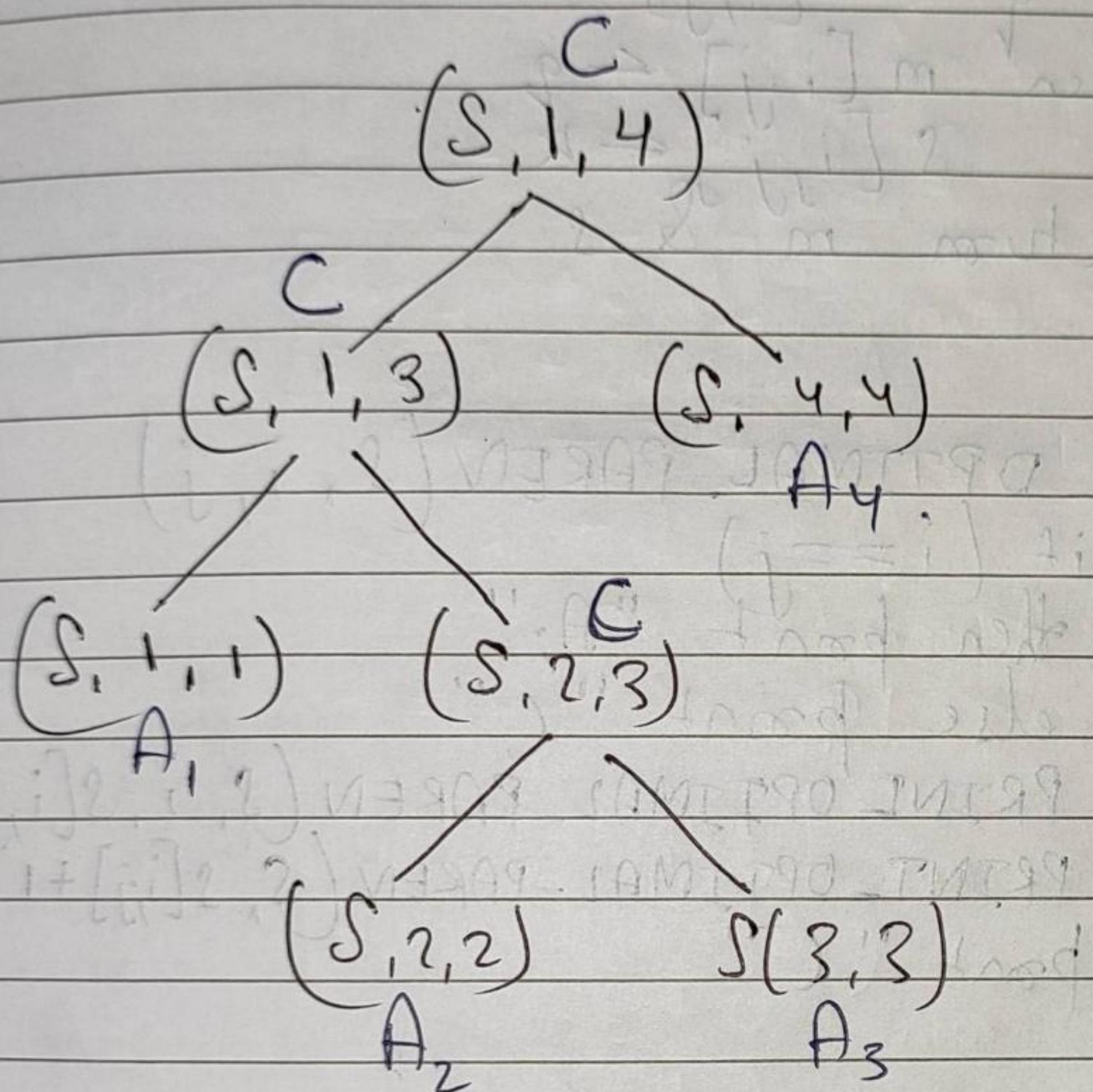
$$\geq 104 \text{ with } k=3$$

$$m[1,4] = \min \left\{ \begin{array}{l} m[1,1] + m[2,4] + P_0 P_1 P_4 \\ m[1,2] + m[3,4] + P_0 P_2 P_4 \\ m[1,3] + m[4,4] + P_0 P_3 P_4 \end{array} \right.$$

$$= \min \left\{ \begin{array}{l} 0 + 104 + 5 \cdot 4 \cdot 7 \\ 120 + 84 + 5 \cdot 6 \cdot 2 \\ 88 + 0 + 5 \cdot 2 \cdot 7 \end{array} \right.$$

$$= \min(244, 414, 158)$$

= 158 with $k = 3$.



$$\Rightarrow ((A_1) \cdot (A_2 A_3)) \cdot A_4) \text{ Any}$$

Algorithm :-

1. $n \leftarrow \text{length}[P] - 1$
2. $\text{for } i = 1 \text{ to } n$
3. $\text{do } m[i, i] \leftarrow 0$
4. $\text{for } l = 2 \text{ to } n$
5. $\text{do for } i = 1 \text{ to } n-l+1$

6. do $j \leftarrow i+l-1$
 7. $m[i,j] \leftarrow \infty$
 8. for $k \leftarrow 1$ to $j-1$
 9. do $q \leftarrow m[j,k] + m[k+1,j] + P_{i-1} P_k P_j$
 10. if $q < m[i,j]$
 11. then $m[i,j] \leftarrow q$
 12. $s[i,j] \leftarrow k$
 13. return m & s

PRINT_OPTIMAL_PAREN(s, i, j)

1. if ($i == j$)
 2. then print "A;"
 3. else print "("
 4. PRINT_OPTIMAL_PAREN($s, i, s[i,j]$)
 5. PRINT_OPTIMAL_PAREN($s, s[i,j]+1, j$)
 6. print ")"

Optimal Binary Search Tree

Binary Search Tree :- Tree in which left subtree contain nodes with keys less than node's key and right subtree with nodes greater than node's key.

	1, 2, 3, 4
Keys	10, 20, 30, 40
frequency	4, 2, 6, 3

Ans →

0	1	2	3	4	total
0	4	8	20 ³	26 ³	0
0	2	10 ³	16 ³	2	
0	6	12 ³	2		
0	3	3			
0		4			

$$c[i, j] = \min_{i \leq k < j} \{ c[i, k] + c[k+1, j] + w[i, j] \}$$

$$\begin{aligned} c[0, 1] &= \min [c[0, 0] + c[1, 1] + w[0, 1]] \\ &= \min (0 + 0 + 4) \\ &= 4 \end{aligned}$$

$$\begin{aligned} c[1, 2] &= \min [c[1, 1] + c[2, 2] + w[1, 2]] \\ &= \min (0 + 0 + 2) \\ &= 2 \end{aligned}$$

$$\begin{aligned} c[2, 3] &= \min [c[2, 2] + c[3, 3] + w[2, 3]] \\ &\geq \min [0 + 0 + 6] \\ &= 6 \end{aligned}$$

$$\begin{aligned} c[3, 4] &= \min [c[3, 3] + c[4, 4] + w[3, 4]] \\ &\geq \min (0 + 0 + 3) \\ &= 3 \end{aligned}$$

$$c[0,2] = \min \left\{ \begin{array}{l} c[0,0] + c[\underline{1},2] + w[0,2] \\ c[0,1] + c[\cancel{1},2] + w[0,2] \end{array} \right.$$

$$= \min \left\{ \begin{array}{l} 0 + 2 + (1+2) \\ 4 + 0 + (4+2) \end{array} \right.$$

$$\geq \min(8, 10)$$

$$\geq 8 \text{ with } k+1 = 1$$

$$c[1,3] = \min \left\{ \begin{array}{l} c[1,1] + c[2,3] + w[1,3] \\ c[\cancel{1},2] + c[3,3] + w[1,3] \end{array} \right.$$

$$\geq \min \left\{ \begin{array}{l} 0 + 6 + (2+6) \\ 28 + 0 + 8 \end{array} \right.$$

$$= \min(14, 10)$$

$$\geq 10 \text{ with } k+1 = 3.$$

$$c[2,4] = \min \left\{ \begin{array}{l} c[2,2] + c[3,4] + w[2,4] \\ c[2,3] + c[4,4] + w[2,4] \end{array} \right.$$

$$\geq \min \left\{ \begin{array}{l} 0 + 3 + 9 \\ 6 + 0 + 9 \end{array} \right.$$

$$\geq \min(12, 15)$$

$$\geq 12 \text{ with } k+1 = 3$$

$$c[0,3] = \min \left\{ \begin{array}{l} c[0,0] + c[1,3] + w[0,3] \\ c[0,1] + c[2,3] + w[0,3] \\ c[0,2] + c[3,3] + w[0,3] \end{array} \right.$$

$$\geq \min \left\{ \begin{array}{l} 0 + 10 + 12 \\ 4 + 6 + 12 \\ 8 + 0 + 12 \end{array} \right.$$

$$\geq \min(22, 22, 20)$$

$$\geq 20 \text{ with } k+1 = 3$$

$$c[1,4] = \min \left\{ \begin{array}{l} c[1,1] + c[1,4] + w[1,4] \\ c[1,2] + c[3,4] + w[1,4] \\ c[1,3] + c[4,4] + w[1,4] \end{array} \right.$$

$$\Rightarrow \min \left\{ \begin{array}{l} 0 + 12 + 11 \\ 2 + 3 + 11 \\ 10 + 0 + 11 \end{array} \right.$$

$$\Rightarrow \min \{ 23, 16, 21 \}$$

$$\Rightarrow 16 \text{ with } k+1 = 3.$$

$$c[0,4] = \min \left\{ \begin{array}{l} c[0,0] + c[1,4] + w[0,4] \\ c[0,1] + c[2,4] + w[0,4] \\ c[0,2] + c[3,4] + w[0,4] \\ c[0,3] + c[4,4] + w[0,4] \end{array} \right.$$

$$= \min \left\{ \begin{array}{l} 0 + 16 + 15 \\ 8 + 12 + 15 \\ 8 + 3 + 15 \\ 20 + 0 + 15 \end{array} \right.$$

$$\Rightarrow \min \{ 31, 31, 26, 35 \}$$

$$\Rightarrow 31 \text{ with } k+1 = 3$$

