

Design and Analysis of Algorithms

L46: FIFO Branch and Bound 0-1 Knapsack Problem

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Resources

- Text book 2: Horowitz
 - Sec 8.2
- Text book 1: Levitin
 - Sec 12.1, 12.2
- R1: Introduction to Algorithms
 - Cormen et al.
- Youtube link for lecture recording
 - <https://www.youtube.com/watch?v=Ns80I8Vzkrl>

0–1 Knapsack Problem

- Knapsack problem:
 - maximize $\sum_{1 \leq i \leq n} v_i x_i$,
 - subject to $\sum_{1 \leq i \leq n} w_i x_i \leq m$
 - x_i is 0 or 1, and $1 \leq i \leq n$
 - Note: All the weights w_i 's and knapsack capacity m are integers, but values v_i 's can be real numbers.
- 0–1 knapsack is a maximization problem
 - Branch and Bound solves minimization problem.
 - So convert knapsack to minimization problem

BB Search: State Space Tree

- Three possible implementation of search space
 - Depends upon how the list \mathcal{L} of live nodes is implemented
- **L is Queue** i.e. **FIFO** (First In First Out)
 - E-nodes are removed in the order they are added
 - Also called BFS (Breadth First search)
- L is Stack i.e. LIFO (Last in First Out)
 - E-nodes are removed in the reverse order it is added
 - Also called D-search (Depth First search)
- L is Heap (can be min or max heap)
 - E-nodes are removed as min (or max) value
 - Called Least Cost (LC) Search

0–1 Knapsack Problem

- Convert knapsack maximization to minimization
minimize $-\sum_{1 \leq i \leq n} v_i x_i$, (call it cost)
– it maximizes $\sum_{1 \leq i \leq n} v_i x_i$ (values)
subject to $\sum_{1 \leq i \leq n} w_i x_i \leq m$ (knapsack constraint)
- State space tree formation
 - Using fixed tuple size, one variable for each weight
 - Each variable has two values 0 or 1
 - Thus, Each node has two children
 - Using variable tuple size, uses the index of weight
 - Can be easily built from fixed tuple size case

0-1 Knapsack Implementation

- Define $\hat{c}(x)$: a heuristic value for $c(x)$
 - cost till the first node which doesn't fit the knapsack
 - Thus, include its partial value to max the knapsack
- Define $u(x)$: an upper bound for node x .
 - the cost till the first node which doesn't fit the knapsack, but without including the partial value.
- Thus, two functions follows the constraints for node x
$$\hat{c}(x) \leq c(x) \leq u(x)$$
- Maintain single `upper` variable.
 - This indicates the best value i.e. minimum cost solution achieved so far.
- Thus, for any node when $\hat{c}(x) > \text{upper}$
 - Discard that path (i.e. kill that node), prune the tree

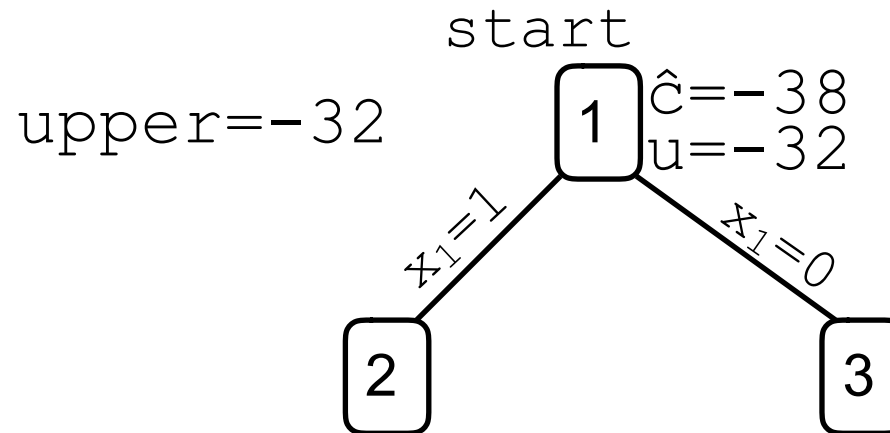
Example: FIFOBB

- Consider knapsack instance with $n=4$, $m=15$, and
 - values $(v_1, v_2, v_3, v_4)=(10, 10, 12, 18)$, and
 - weights $(w_1, w_2, w_3, w_4)=(2, 4, 6, 9)$
 - Fixed implementation implies 4 tuple variables
 - x_1, x_2, x_3, x_4 and each can take value 0 or 1.
- Using fixed tuple implementation, trace FIFOBB
- First In First Out (FIFO) approach
 - Among live nodes, choose that node to explore (E-node) which was added first to queue
 - and not the least cost.

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$



- **start node 1:**

$\hat{c}(x)$: w_1, w_2 , and w_3 contributes fully, w_4 exceeds knapsack

$$\hat{c} = - (10 + 10 + 12 + ((15 - 12) / 9) * 18) = -38$$

$u(x)$: w_1, w_2 , and w_3 contributes fully, w_4 exceeds knapsack

$$u = - (10 + 10 + 12 + 0) = -32]$$

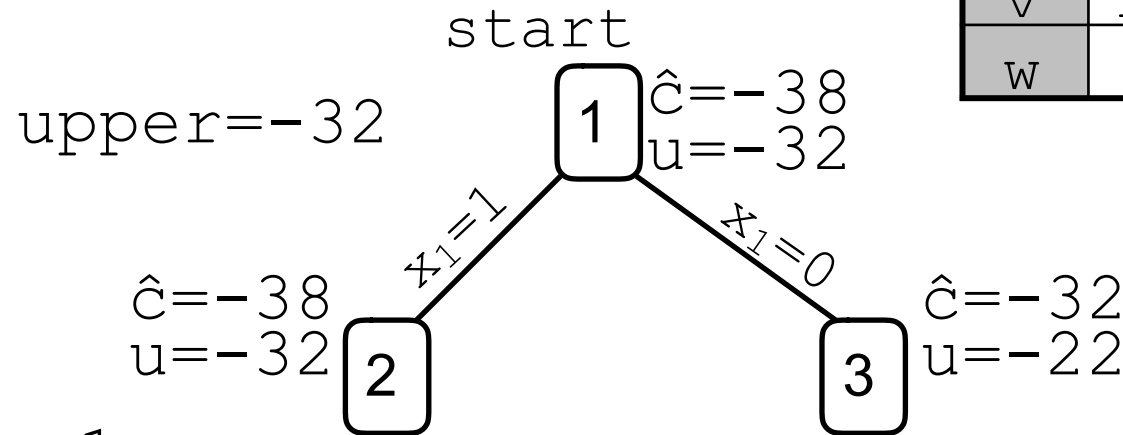
upper=-32

- This node is live node ($\hat{c} \leq \text{upper}$) and only node so far,
- Explore this node, two children
 - $x_1=1$ (include w_1), $x_1=0$ (exclude w_1)

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$



- **node 2: $x_1=1$**

$\hat{c}(x)$: w_1, w_2 , and w_3 contributes fully, w_4 exceeds knapsack

$$\hat{c} = - (10 + 10 + 12 + ((15 - 12) / 9) * 18) = -38$$

$u(x)$: w_1, w_2 , and w_3 contributes fully, w_4 exceeds knapsack

$$u = - (10 + 10 + 12 + 0) = -32$$

$\hat{c}(x)$, $u(x)$, upper don't change

- **node 3: $x_1=0$ (partial weight of w_4 becomes $15 - 10 = 5$)**

$$\hat{c} = - (0 + 10 + 12 + ((15 - 10) / 9) * 18) = -32$$

$$u = - (0 + 10 + 12 + 0) = -22$$

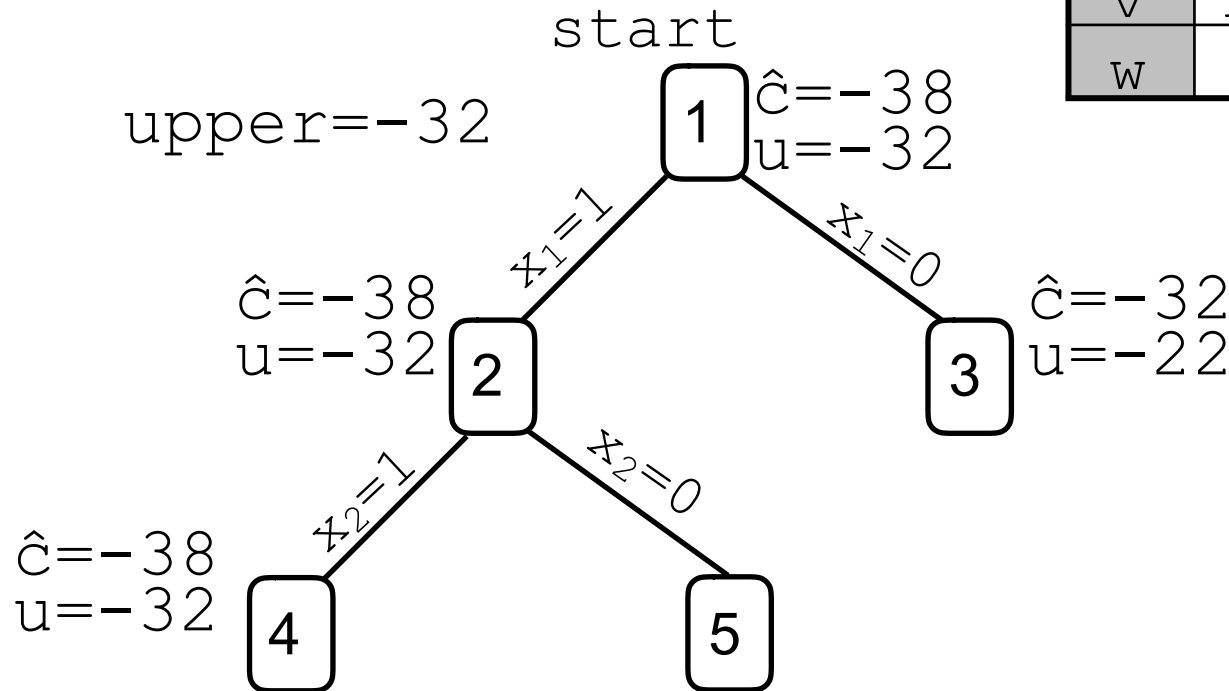
upper remains -32 (doesn't change)

- **Lives nodes : $\{2, 3\}$, ($\hat{c}(x) \leq \text{upper}$)**

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$

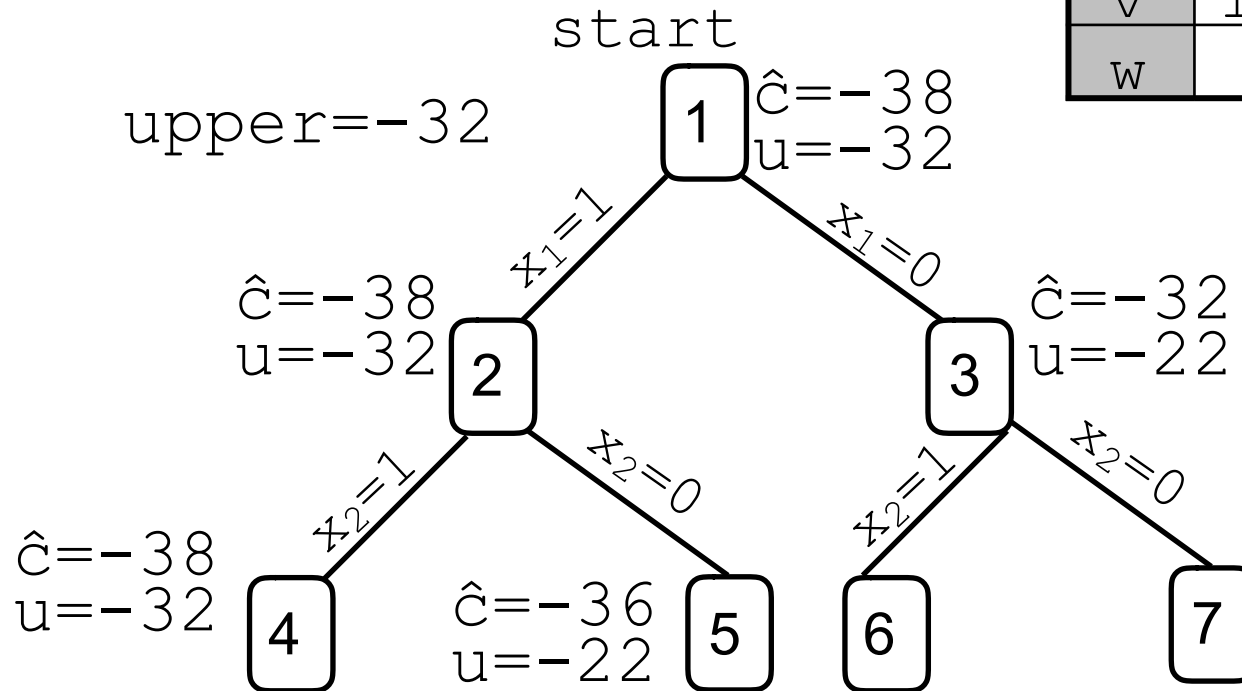


- Using FIFO for $\{2, 3\}$ live nodes, next E-node is 2.
- Explore node 2.
 - $x_2=1$ (node 4), and $x_2=0$ (node 5)
- Node 4:
 - $\hat{c} = -(10+10+12+((15-12)/9)*18) = -38$
 - $u = -(10+10+12+0) = -32$
 - upper remains same and doesn't change

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$

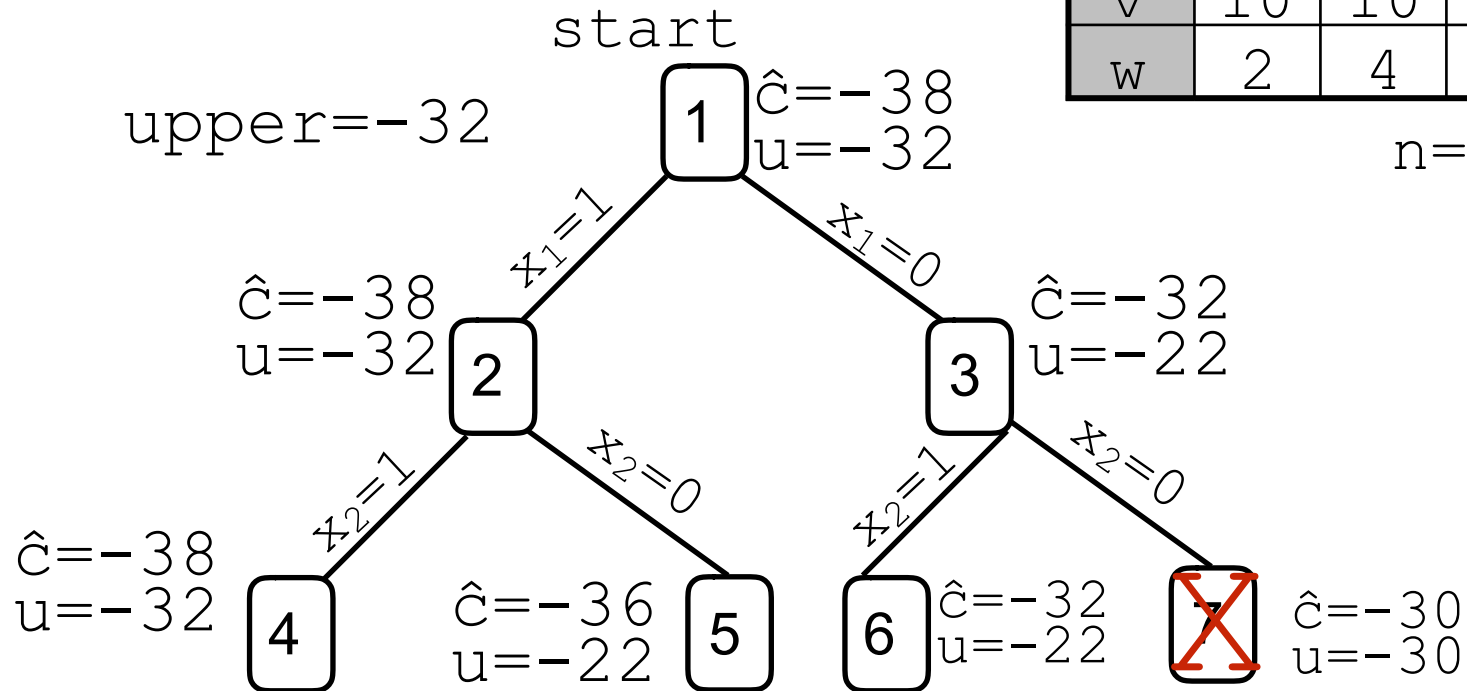


- **Node 5 (partial weight of w_4 becomes $15 - (2 + 6) = 7$)**
 $\hat{c} = - (10 + 0 + 12 + ((15 - 8) / 9) * 18) = -36$
 $u = - (10 + 0 + 12 + 0) = -22$
 upper remains same and doesn't change
- **Lives nodes now: $\{3, 4, 5\}$; $(c(x) \leq \text{upper})$**
- **E-node using FIFO is 3. Explore it**
 - $x_2 = 1$ (node 6), and $x_2 = 0$ (node 7)

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$



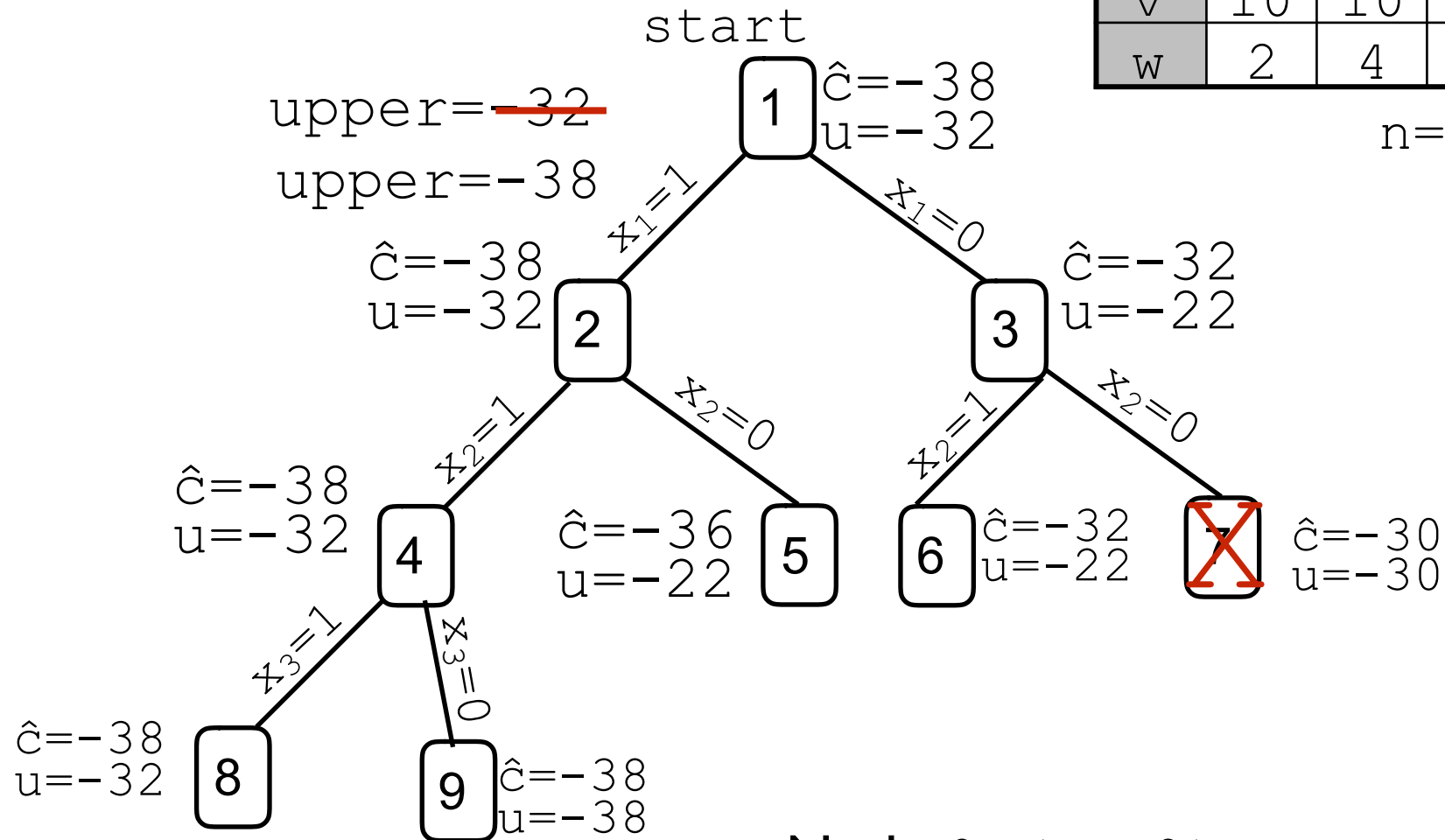
- **Node 6** ($x_2=1$)
 $\hat{c} = -(0+10+12+((15-10)/9)*18) = -32$
 $u = -(0+10+12+0) = -22$
 $upper$ remains same and doesn't change
- **Node 7** ($x_2=0$)
 $\hat{c} = -(0+0+12+18) = -30$
 $u = -(0+0+12+18) = -30$
 $\hat{c}(7) > upper$, thus kill this node

- **Lives nodes now:**
 $\{4, 5, 6\}$;
 $(c(x) \leq upper)$
- **Next E-node: 4**

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$



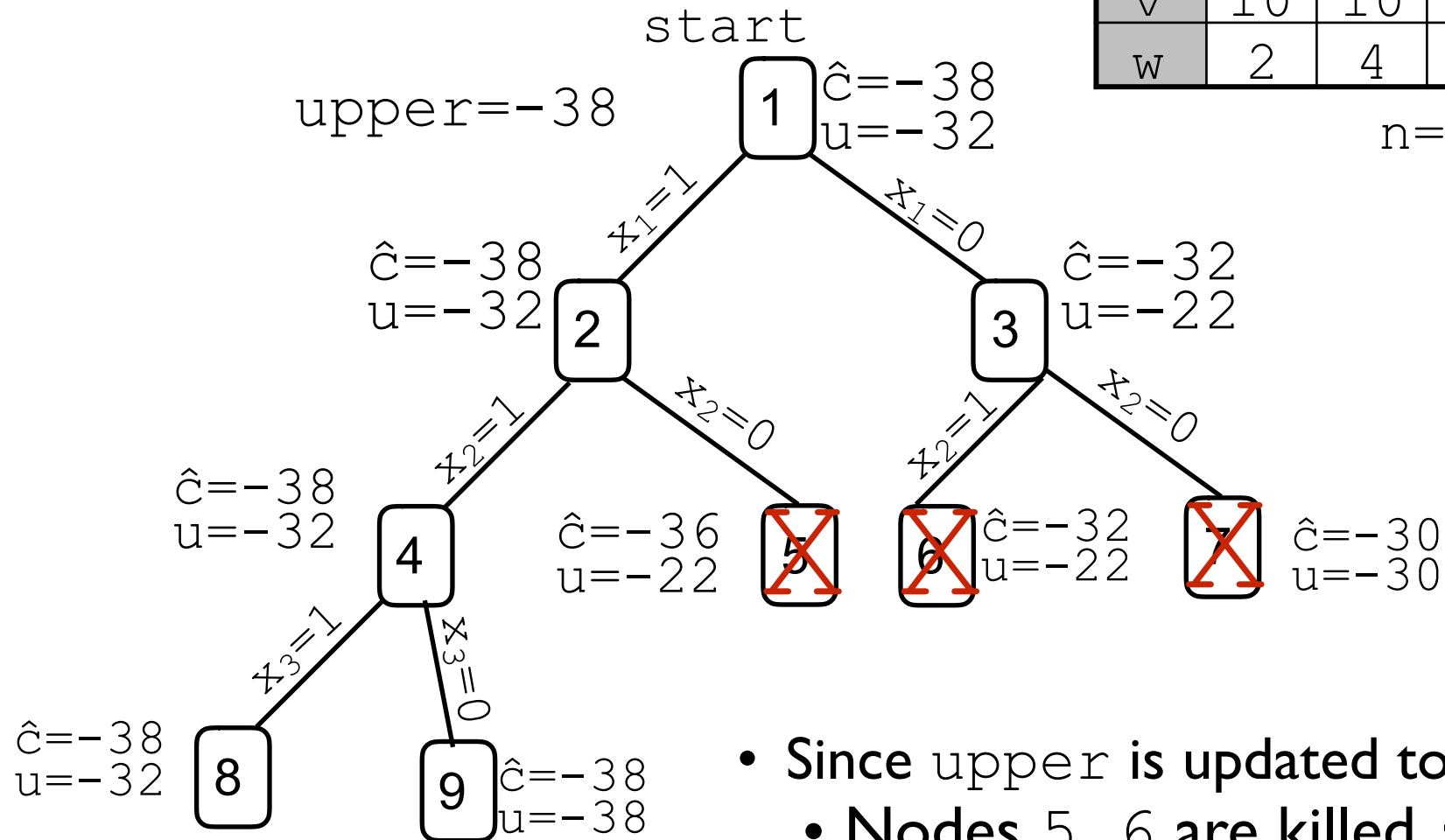
- **Node 8** ($x_3=1$)
 $\hat{c} = -(10+10+12+((15-12)/9)*18) = -38$
 $u = -(10+10+12+0) = -32$
upper remains same

- **Node 9** ($x_3=0$)
 $\hat{c} = -(10+10+0+15) = -38$
 $u = -(10+10+0+18) = -38$
upper is updated to -38

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$

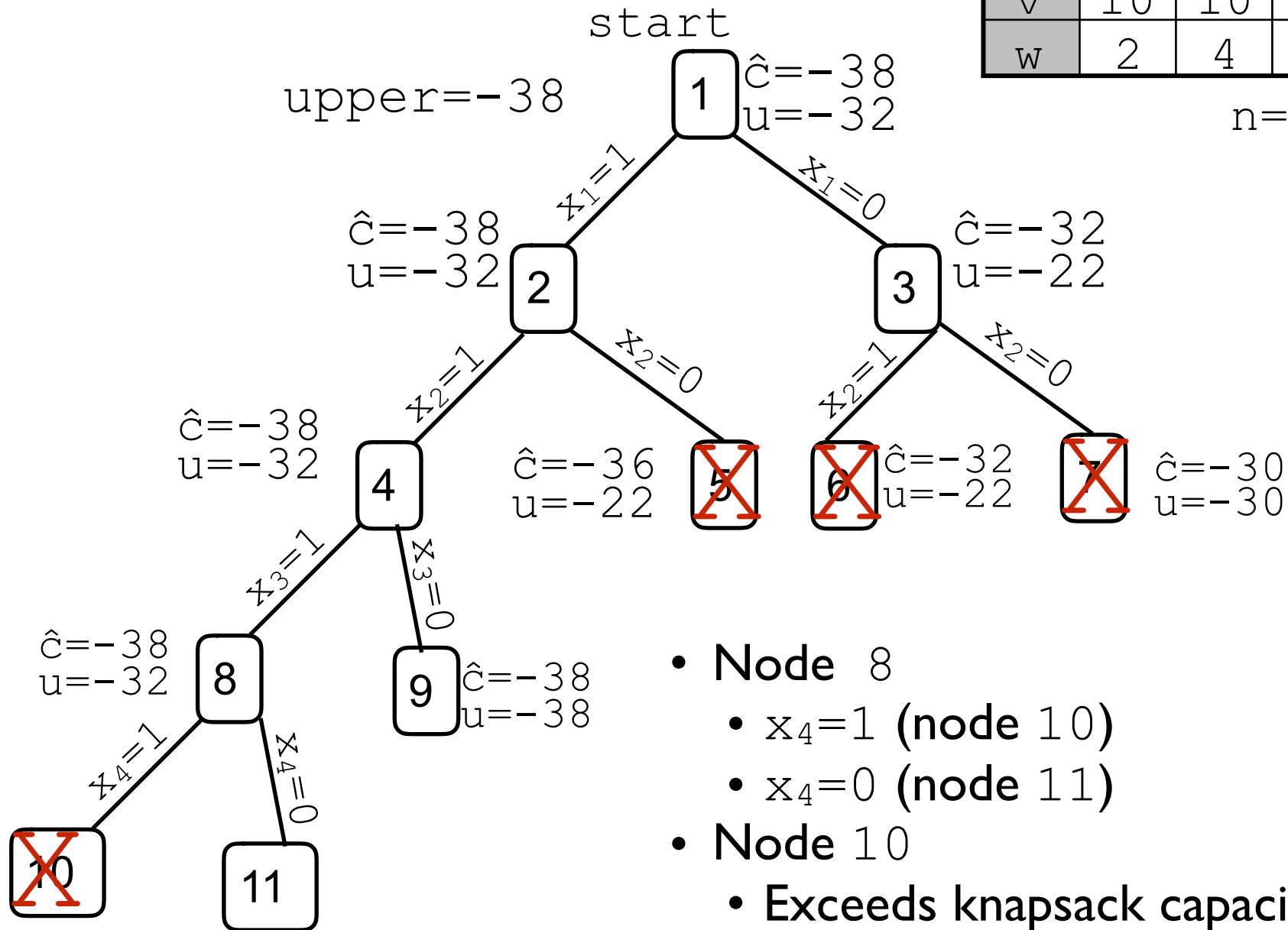


- Since upper is updated to -38 ,
 - Nodes 5, 6 are killed, as
 - their cost $\hat{c}(x) > \text{upper}$
- Thus, live nodes are $\{8, 9\}$
- Next E-node to explore: 8

FIFOBB: 0-1 Knapsack

	1	2	3	4
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$n=4, m=15$

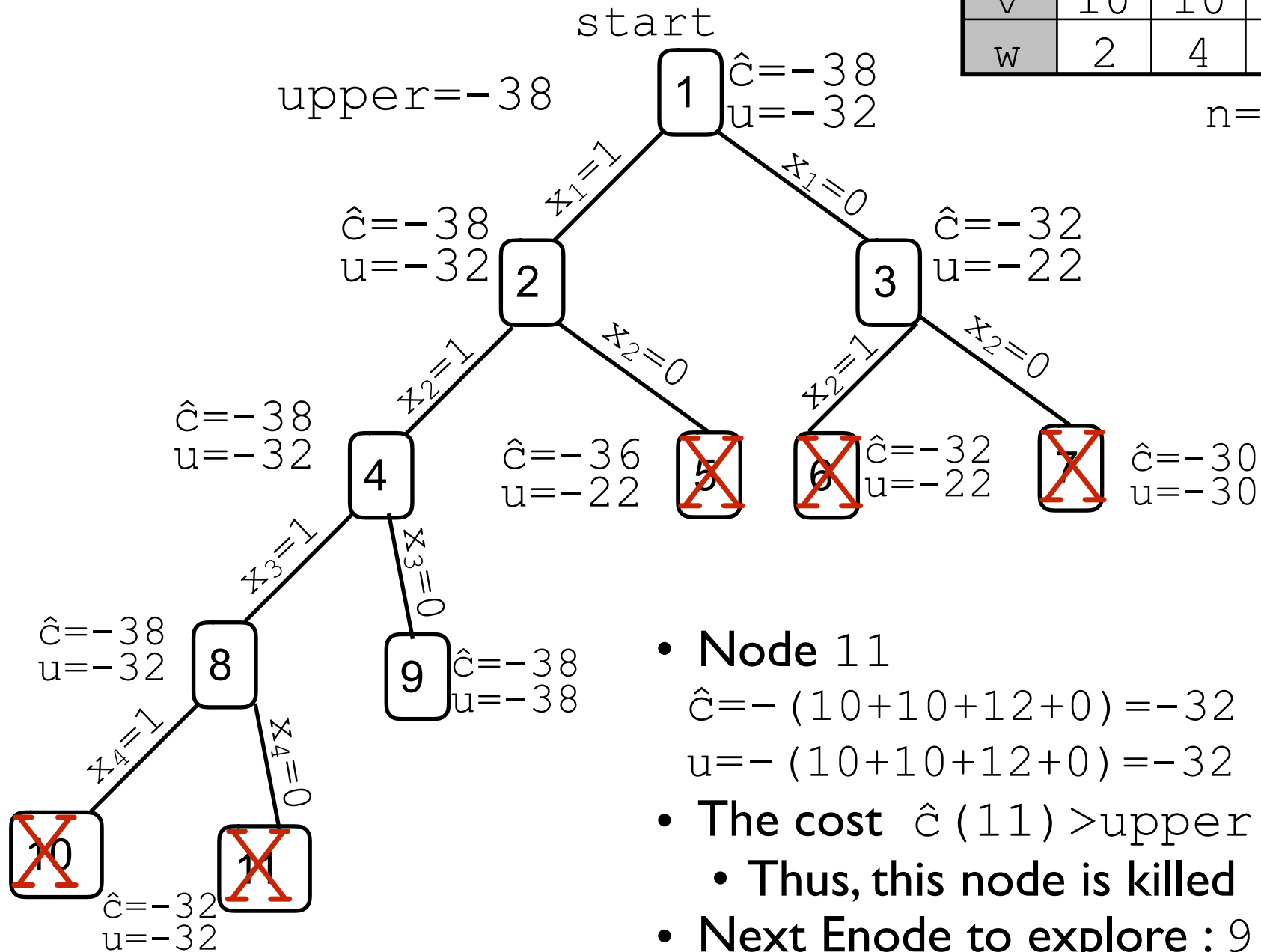


- **Node 8**
 - $x_4=1$ (node 10)
 - $x_4=0$ (node 11)
- **Node 10**
 - Exceeds knapsack capacity.
 - Can't consider it.

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$

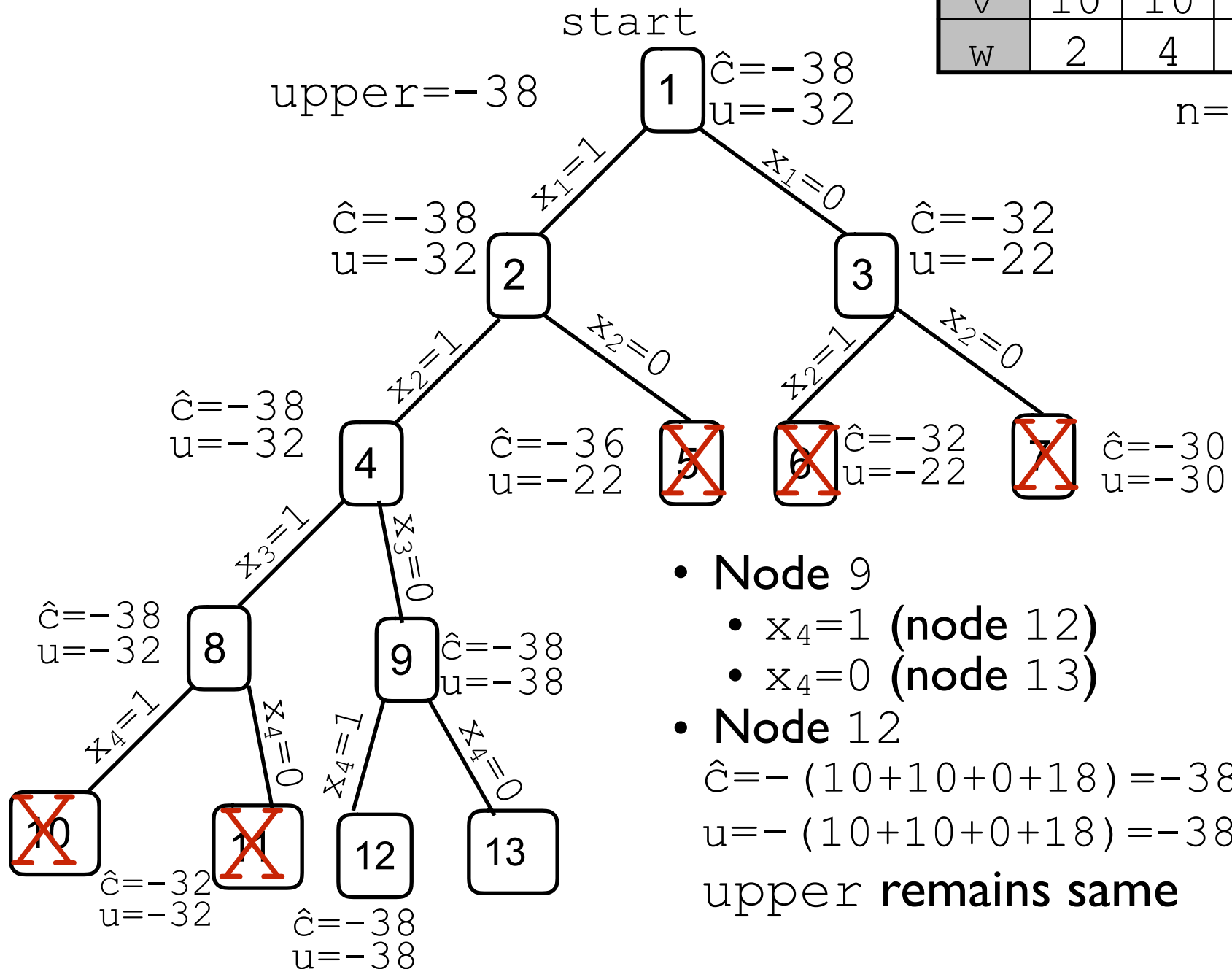


- **Node 11**
 $\hat{c} = -(10+10+12+0) = -32$
 $u = -(10+10+12+0) = -32$
- **The cost $\hat{c}(11) > \text{upper}$**
 - Thus, this node is killed
- **Next Enode to explore : 9**

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

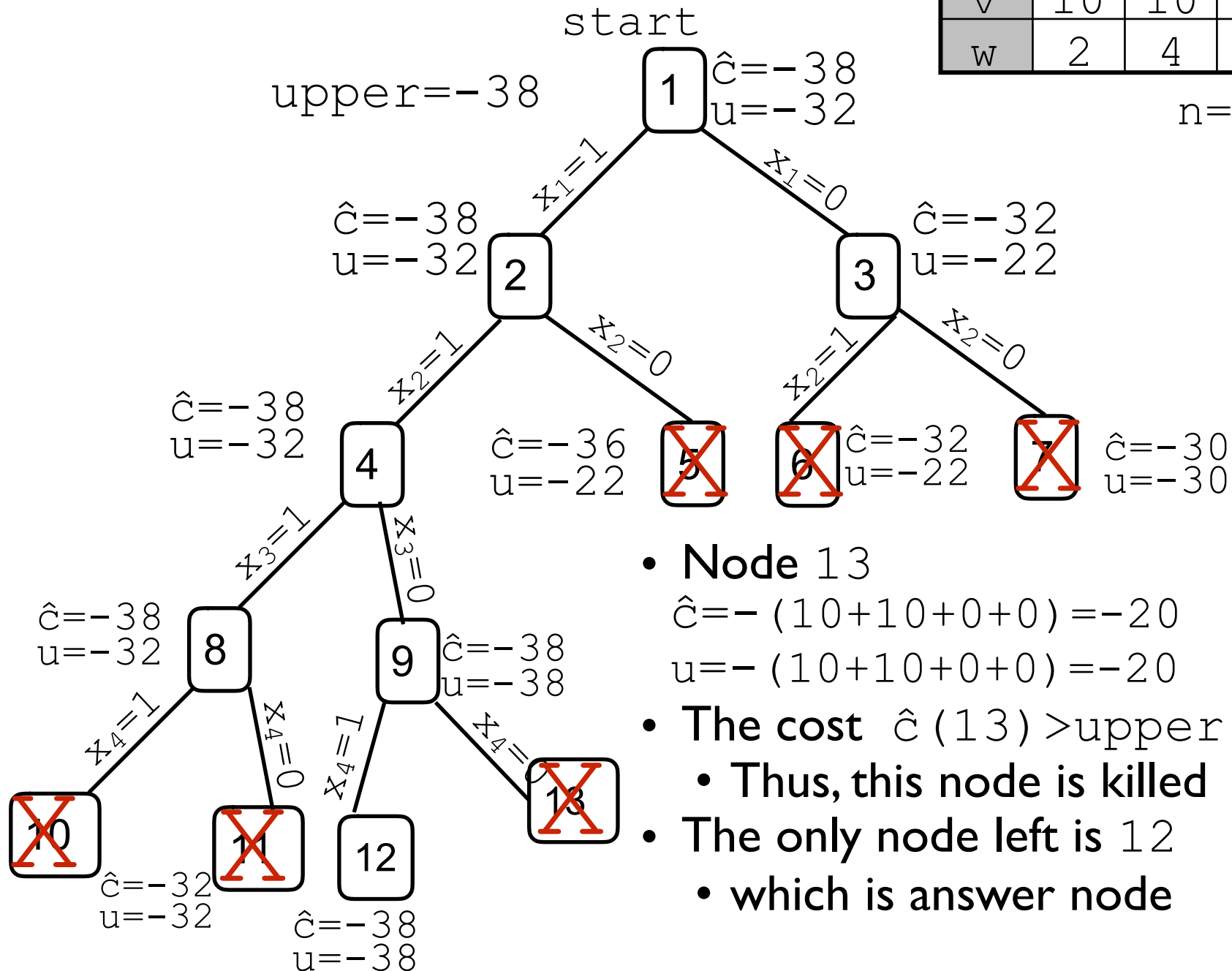
$n=4, m=15$



FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$

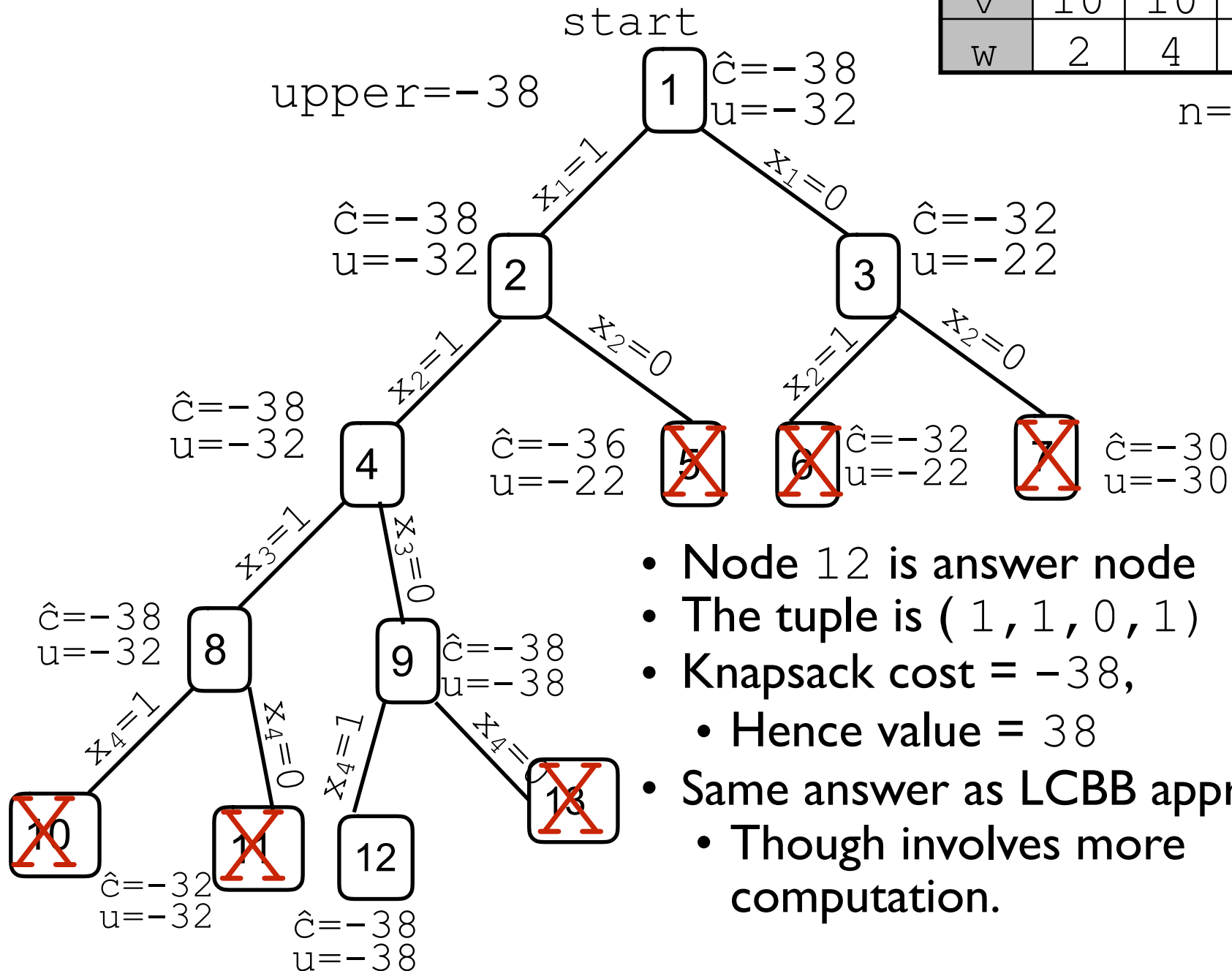


- **Node 13**
 $\hat{c} = -(10+10+0+0) = -20$
 $u = -(10+10+0+0) = -20$
- The cost $\hat{c}(13) > \text{upper}$
 - Thus, this node is killed
- The only node left is 12
 - which is answer node

FIFOBB: 0-1 Knapsack

	1	2	3	4
v	10	10	12	18
w	2	4	6	9

$n=4, m=15$



- Node 12 is answer node
- The tuple is $(1, 1, 0, 1)$
- Knapsack cost = -38 ,
 - Hence value = 38
- Same answer as LCBB approach
 - Though involves more computation.

Summary:

- FIFO Branch and Bound for $0-1$ Knapsack problem
- Need to do more (exploration) computation as compared to LCBB.