



Ch21.Backtracking



Bird's-Eye View

- A surefire way to solve a problem is to make a list of all candidate answers and check them
 - If the problem size is big, we can not get the answer in reasonable time using this approach
 - List all possible cases? → exponential cases
- By a systematic examination of the candidate list, we can find the answer without examining every candidate answer
 - *Backtracking* and *Branch and Bound* are most popular systematic algorithms

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- The Backtracking Method
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 - Rat in a Maze
 - Container Loading



Backtracking Steps (1 & 2)

- Step 1: Define a solution space
 - Solution space is a space of possible choices including at least one solution
 - In the case of the rat-in-a-maze problem, the solution space consists of **all paths from the entrance to the exit**
 - In the case of chess, the solution space consists of **all possible locations of checkers**
- Step 2: Construct **a graph or a tree** representing the solution space
 - Solution space can be represented either by a tree or by a graph, depending on the characteristic of the problem
 - In the case of the rat-in-a-maze problem, the solution space can be represented by **a graph**
 - The solution space for container loading is **a tree**



Backtracking Step (3)

- Step 3: Search the graph or the tree in a depth-first manner to find a solution
 - Two nodes
 - a live node (node from which we can reach to the solution)
 - an E-node (node representing the current state)
 - We start from the start node (node representing initial state)
 - Initially, the start node is both a live node and an E-node
 - Try to move to a new node (node representing a new state we have never seen)
 - Success → Push current node into the stack if it is live, and make the new node a live node & E-node
 - Fail → Current node *dies* (i.e. it is no longer live) and we move back (*backtrack*) to the most recently seen live node in the stack
 - The search terminates when
 - we have found the answer, or
 - we run out of live nodes to back up to



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Rat in a Maze

- 3 x 3 rat-in-a-maze instance (Example 21.1)

entrance	0	0	0	
	0	1	1	
	0	0	0	exit

0 : road
1 : obstacle

- A maze is a tour puzzle in the form of a complex branching passage through which the solver must find a route
 - A maze is a graph
 - So, we can traverse a maze using DFS / BFS
- **Backtracking** → Finding solution using DFS
 - Worst-case time complexity of finding path to the exit of $n \times n$ maze is $O(n^2)$



Backtracking in “Rat in a Maze”

1. Prepare an empty stack S and an empty 2D array
2. Initialize array elements with 1 where obstacles are, 0 elsewhere
3. Start at the upper left corner
4. Set the array value of current position to 1
5. Check adjacent (up, right, down and left) cell whose value is zero
 - If we found such cell, **push current position** into the stack and move to there
 - If we couldn't find such cell, **pop a position** from the stack and move to there
6. If we haven't reach to the goal, repeat from 4



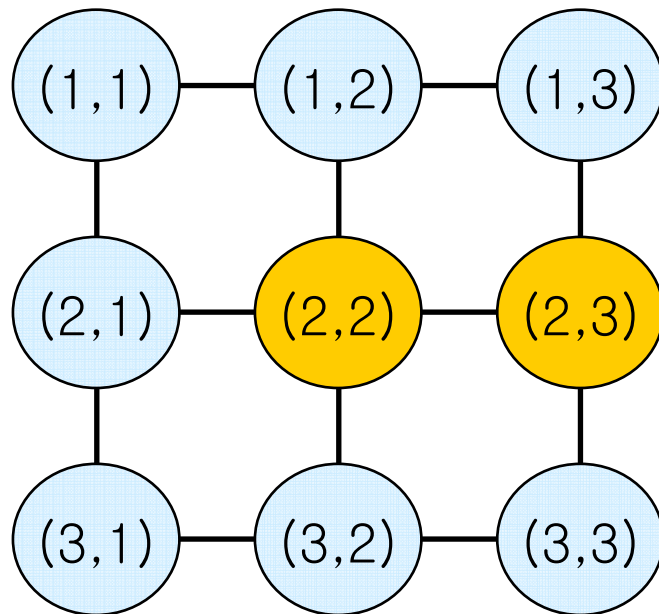
Rat in a Maze Code

```
Prepare an empty stack and an empty 2D array
Initialize array elements with 1 where obstacles are, 0 elsewhere
i ← 1
j ← 1
Repeat until reach to the goal {
    a[i][j] ← 1;
    if (a[i][j+1]==0) {      put (i,j) into the stack
                            j++; }
    else if(a[i+1][j]==0) {  put (i,j) into the stack
                            i++; }
    else if (a[i][j-1]==0) { put (i,j) into the stack
                            j--; }
    else if (a[i-1][j]==0) { put (i,j) into the stack
                            i--; }
    else pop (i,j) from the stack;
}
```

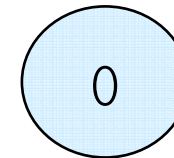
Rat in a Maze Example (1)

- Organize the solution space

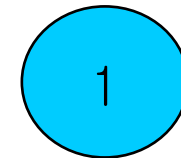
entrance
node



live:

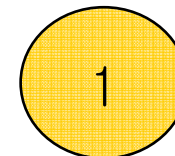


new



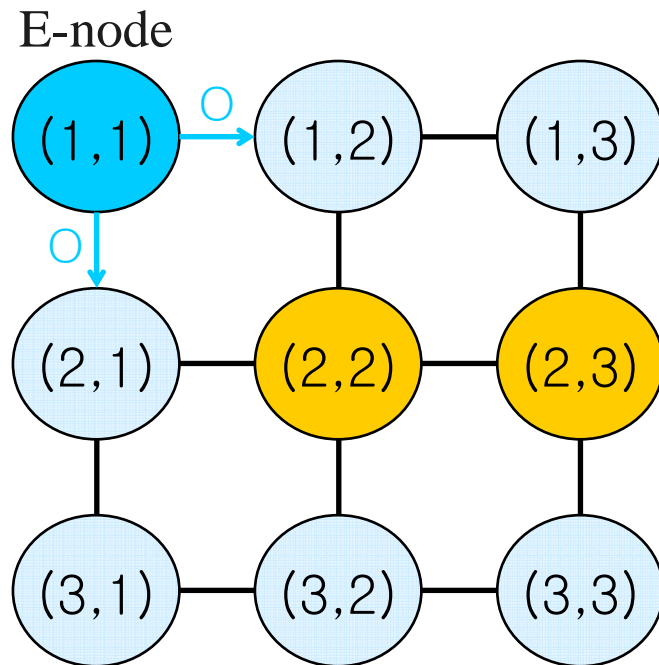
visited

dead:



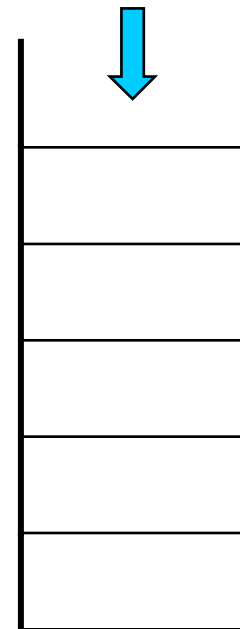
Rat in a Maze Example (2)

- Search the graph in a depth-first manner to find a solution



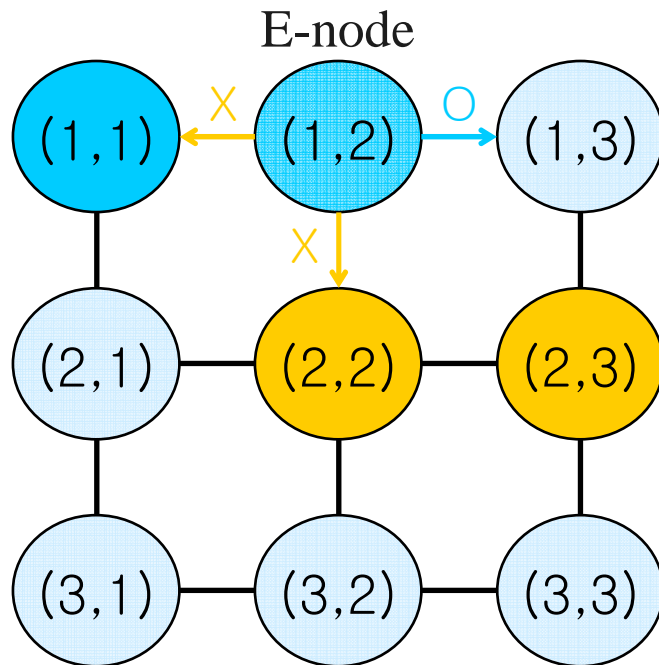
Push (1,1) &
Move to (1,2)

Live node stack



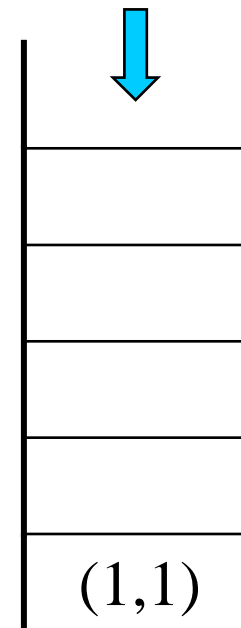
Rat in a Maze Example (3)

- Search the graph in a depth-first manner to find a solution



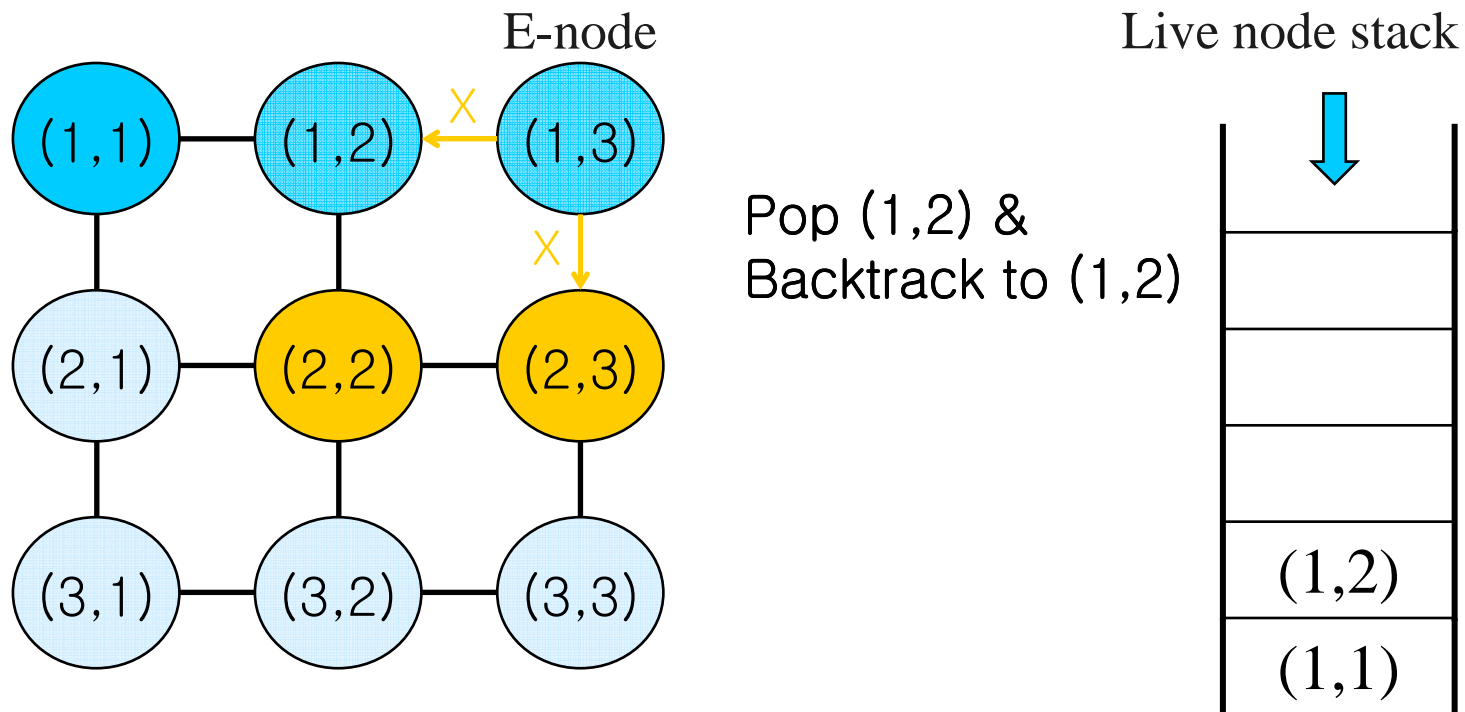
Push (1,2) &
Move to (1,3)

Live node stack



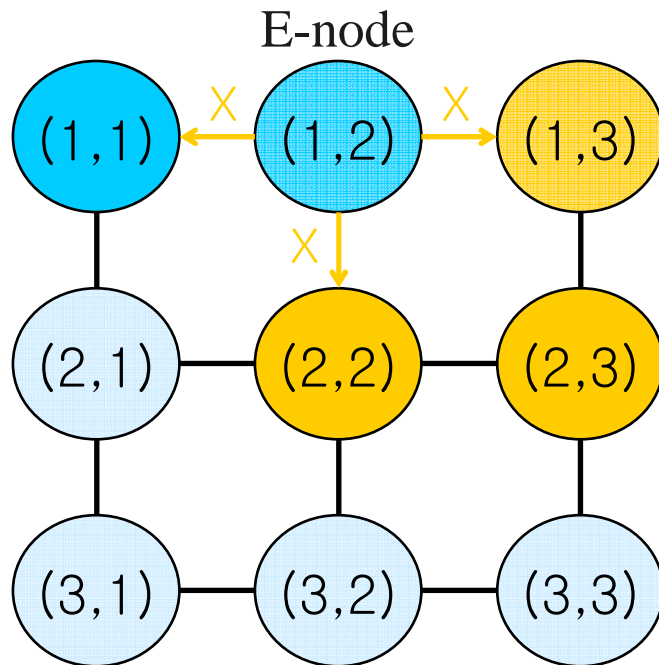
Rat in a Maze Example (4)

- Search the graph in a depth-first manner to find a solution



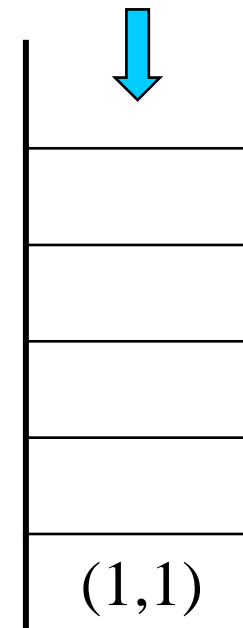
Rat in a Maze Example (5)

- Search the graph in a depth-first manner to find a solution



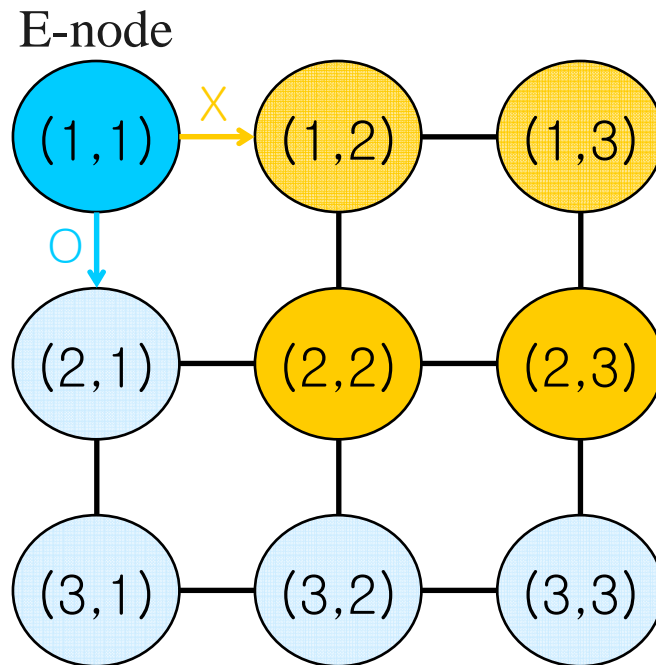
Pop (1,1) &
Backtrack (1,1)

Live node stack



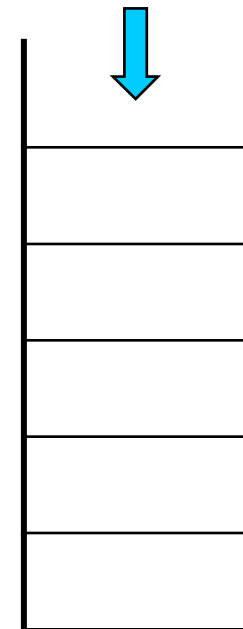
Rat in a Maze Example (6)

- Search the graph in a depth-first manner to find a solution



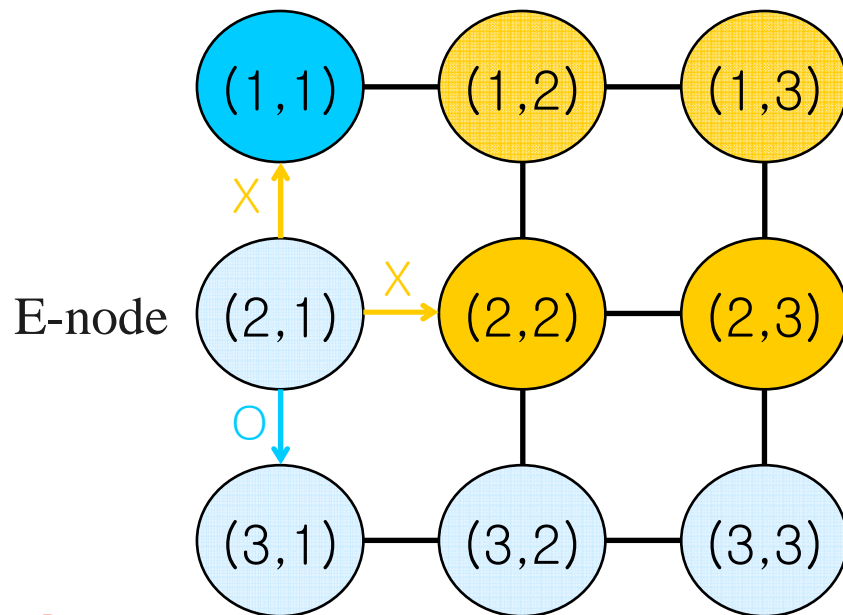
Push (1,1) &
Move to (2,1)

Live node stack



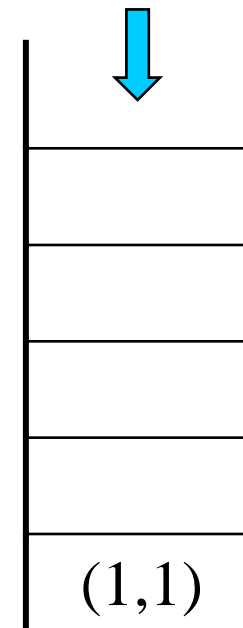
Rat in a Maze Example (7)

- Search the graph in a depth-first manner to find a solution



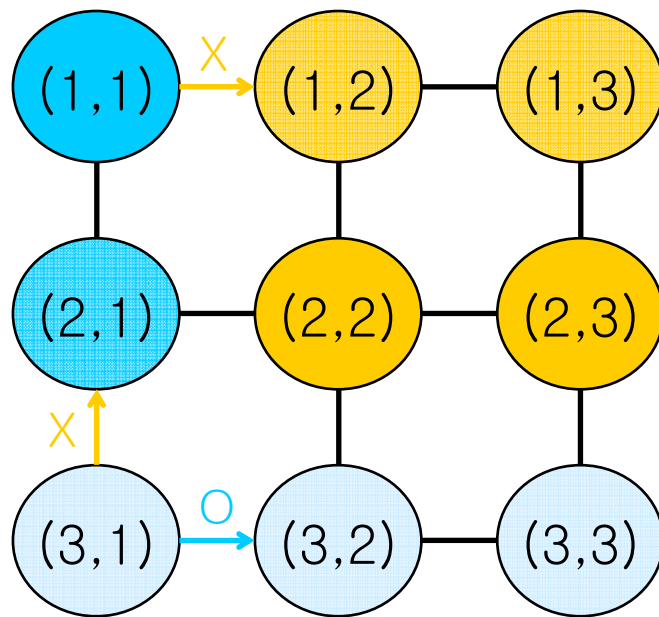
Push (2,1) &
Move to (3,1)

Live node stack



Rat in a Maze Example (8)

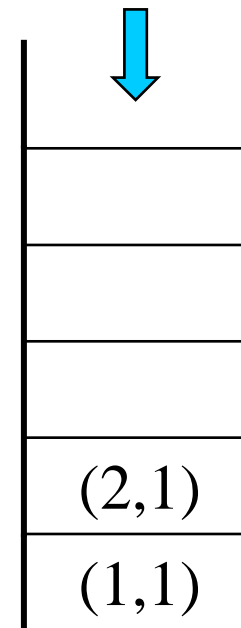
- Search the graph in a depth-first manner to find a solution



E-node

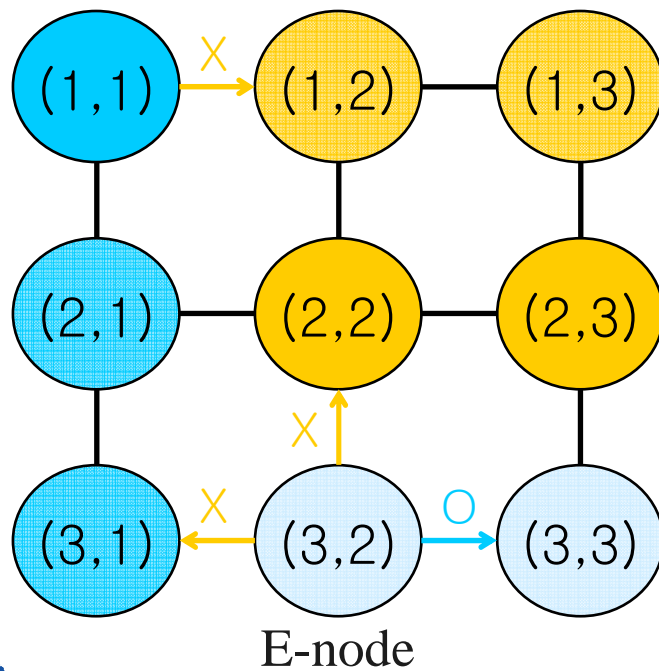
Push (3,1) &
Move to (3,2)

Live node stack



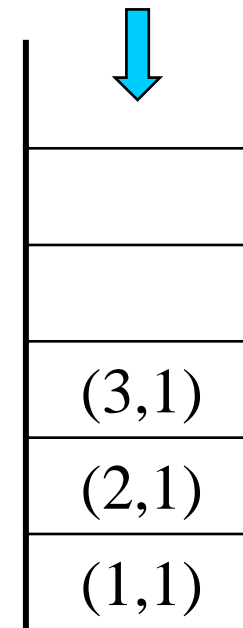
Rat in a Maze Example (9)

- Search the graph in a depth-first manner to find a solution



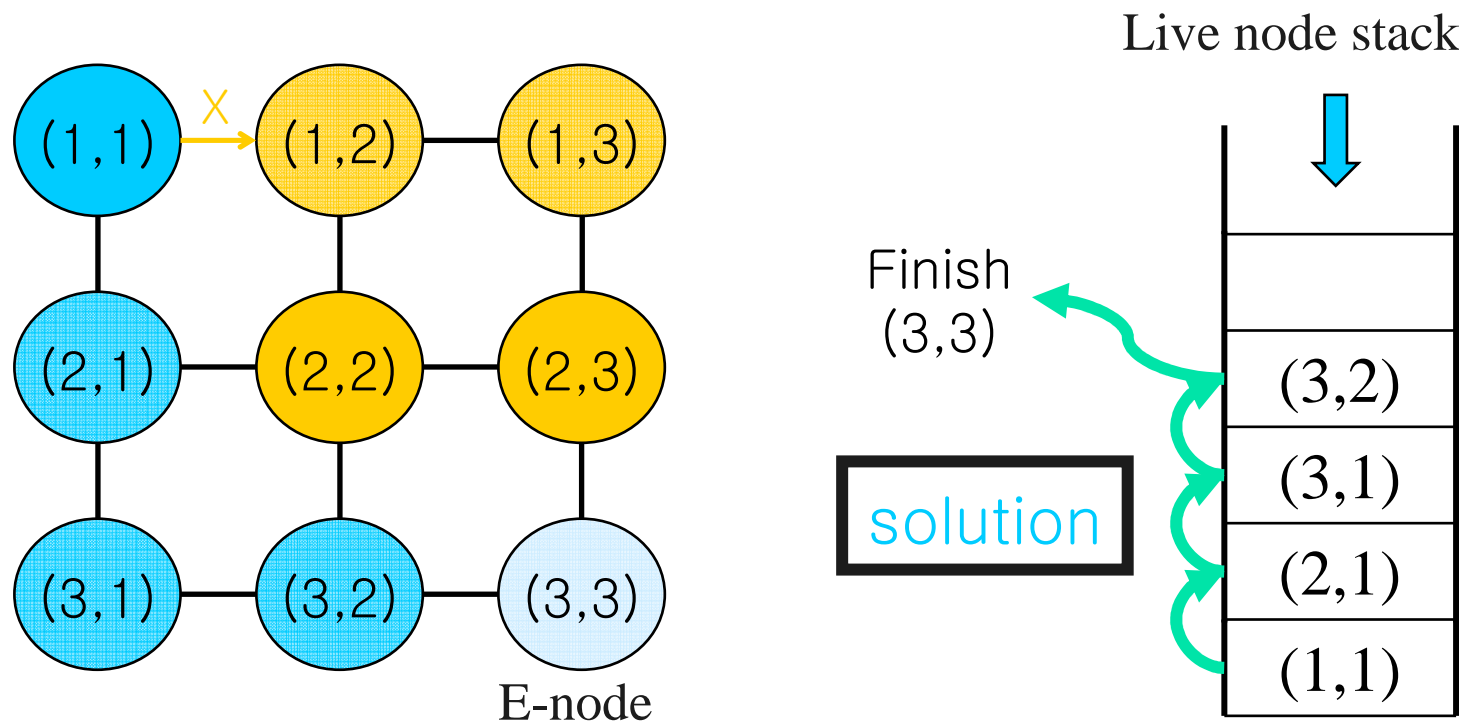
Push (3,2) &
Move to (3,3)

Live node stack



Rat in a Maze Example (10)

- Search the graph in a depth-first manner to find a solution



- Observation

- Backtracking solution may not be a shortest path
- Nodes in the stack represent the solution



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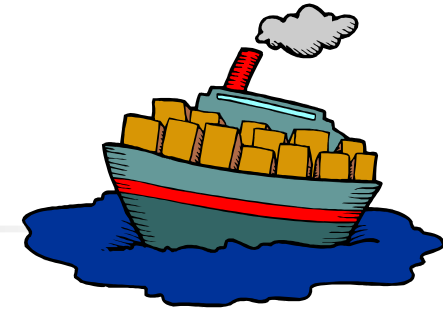
Container Loading

■ Container Loading Problem (Example 21.4)

- 2 ships and n containers
- Ship capacity: c_1, c_2
- The weight of container i : w_i
- $$\sum_{i=1}^n w_i \leq c_1 + c_2$$
- Is there a way to load all n containers?

■ Container Loading Instance

- $n = 4$
 - $c_1 = 12, c_2 = 9$
 - $w = [8, 6, 2, 3]$
- Find a subset of the weights with sum as close to c_1 as possible





Considering only One Ship

- Original problem: Is there any way to load n containers with

$$\sum_{i \text{ belongs to ship}_1} w_i \leq c_1, \quad \sum_{i \text{ belongs to ship}_2} w_i \leq c_2$$

- Because $\sum_{i \text{ belongs to ship}_1} w_i + \sum_{i \text{ belongs to ship}_2} w_i = \sum_{i=1}^n w_i$ is constant,

$$\max\left(\sum_{i \text{ belongs to ship}_1} w_i\right) = \min\left(\sum_{i \text{ belongs to ship}_2} w_i\right)$$

- So, all we need to do is trying to load containers at ship 1 **as much as possible** and check if the sum of weights of remaining containers is less than or equal to c_2



Solving without Backtracking

- We can find a solution with brute-force search

1. Generate n random numbers x_1, x_2, \dots, x_n
where $x_i = 0$ or 1 ($i = 1, \dots, n$)
2. If $x_i = 1$, we put i -th container into ship 1
If $x_i = 0$, we put i -th container into ship 2
3. Check if sum of weights in both ships are less
than their maximum capacity
 - 3-1. If so, we found a solution!
 - 3-2. Otherwise, repeat from 1

- Above method are too naïve and not duplicate-free
- ➔ **Backtracking** provides a systematic way to search feasible solutions (still NP-complete, though)



Container Loading and Backtracking

- Container loading is one of NP-complete problems
 - There are 2^n possible partitionings
- If we represent the decision of location of each container with a *branch*, we can represent container loading problem with a *tree*
- Organize the solution space
 - Solution space is represented as a **binary tree**
 - Every node has a label, which is an identifier
- So, we can traverse the tree using DFS / BFS
- Backtracking = **Finding solution using DFS**
- Worst-case time complexity is $O(2^n)$ if there are n containers



Backtracking in Container Loading

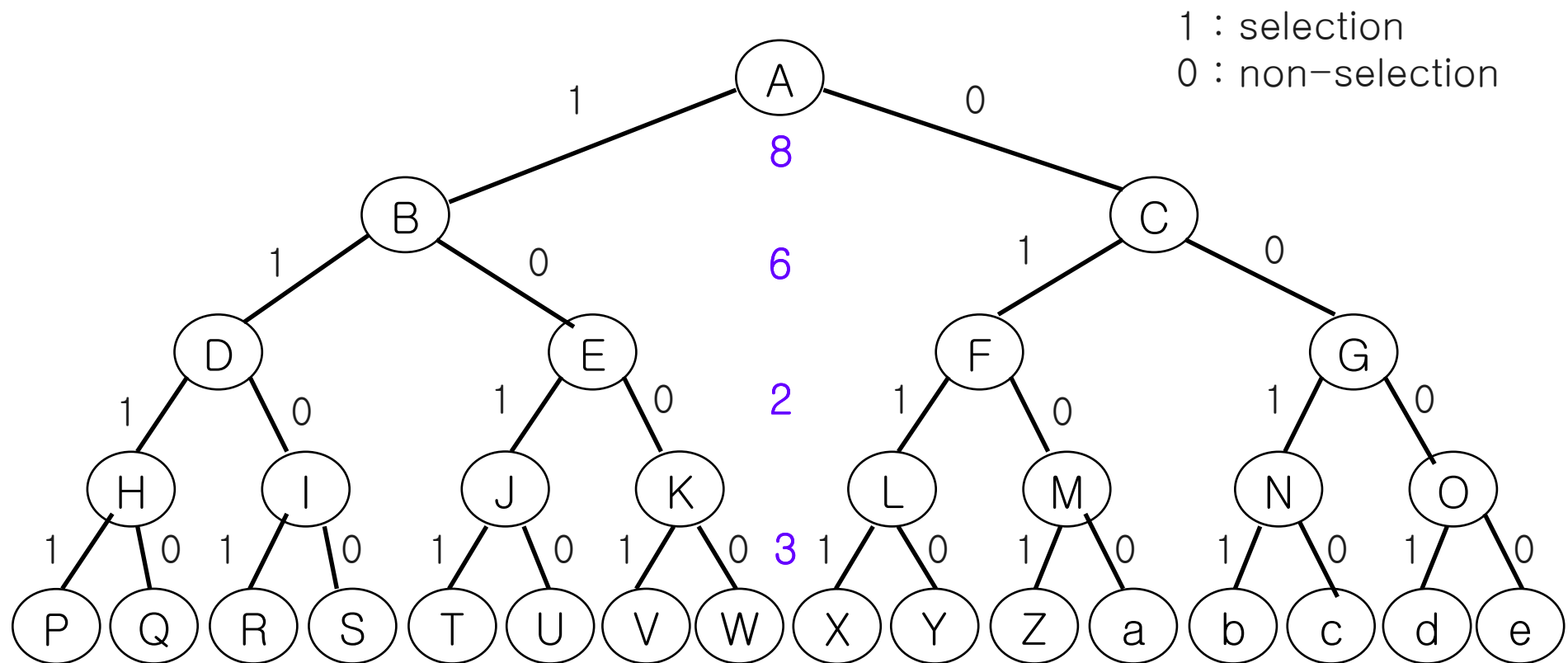
1. Prepare an empty stack S and a complete binary tree T with depth n
2. Initialize the max to zero
3. Start from root of T
4. Let t as current node
5. If we haven't visit left child and have space to load $w_{\text{depth}(t)}$,
then load it, **push t into S** and move to left child
else if we haven't visit right child, **push t into S** and move to right child
6. If we failed to move to the child, check if the stack is empty
 1. If the stack is not empty, **pop a node** from the stack and move to there
7. If current sum of weights is greater than max , update max
8. Repeat from 4 until we have checked all nodes

Container Loading Code

```
Consider n, c1, c2, w are given
Construct a complete binary tree with depth n & Prepare an empty stack
max ← 0;    sum ← 0;    depth ← 0;    x ← root node of the tree;
While (true) {
    if (depth < n && !x.visitedLeft && c1 - sum ≥ w[depth]) {
        sum ← sum + w[depth]
        if (sum > max) max = sum;
        Put (x,sum) into the stack
        x.visitedLeft ← true;
        x ← x.leftChild;
        depth++; }
    else if (depth < n && !x.visitedRight) {
        Put (x,sum) into the stack
        x.visitedRight ← true;
        x ← x.rightChild;
        depth++; }
    else { if (the stack is empty) {
        If sum(w) - max ≤ c2, max is the optimal weight
        Otherwise, it is impossible to load all containers
        Quit the program    }
        Pop (x,sum) from the stack;
        depth--;}
}
```

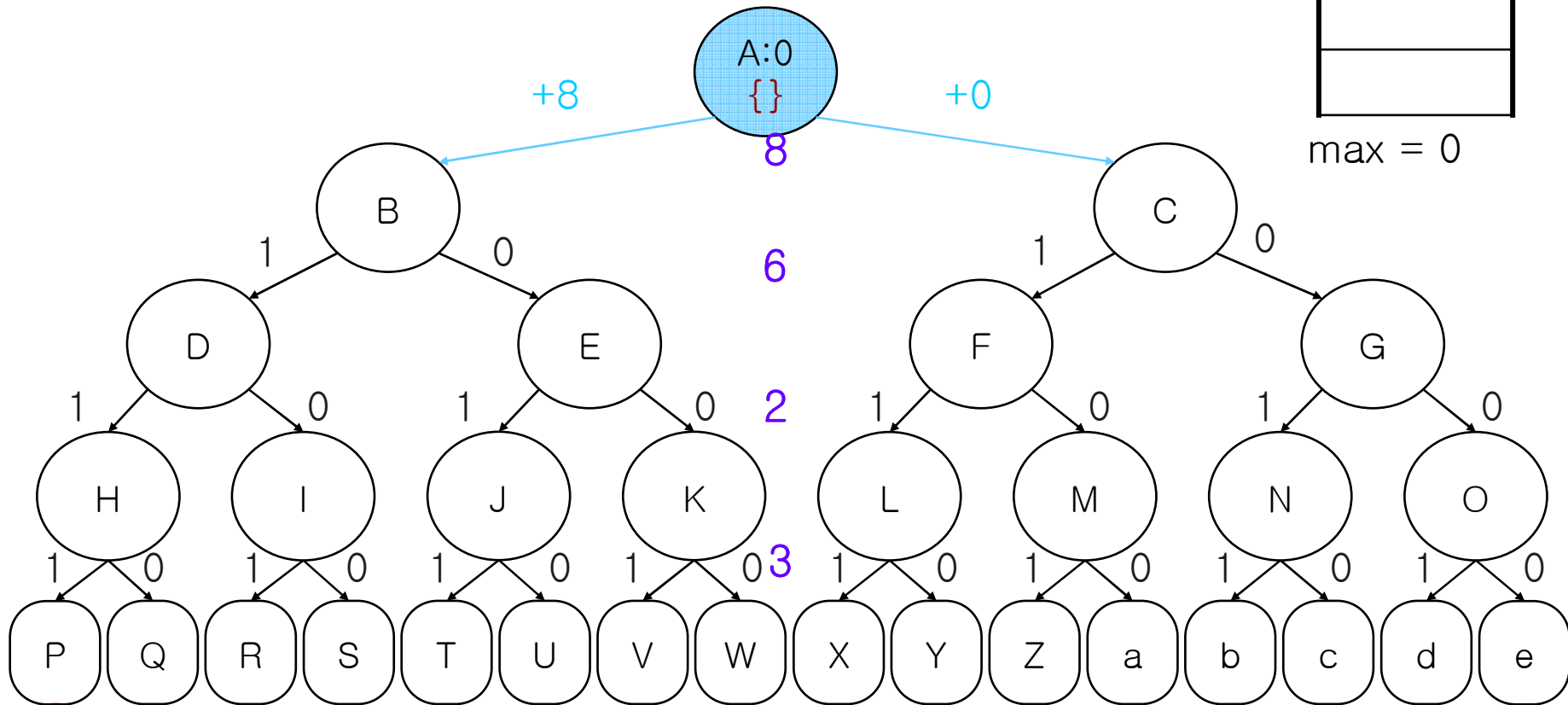
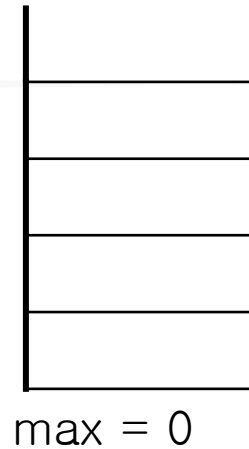
Container Loading Example (1)

- Organize the solution space: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$



Container Loading Example (2)

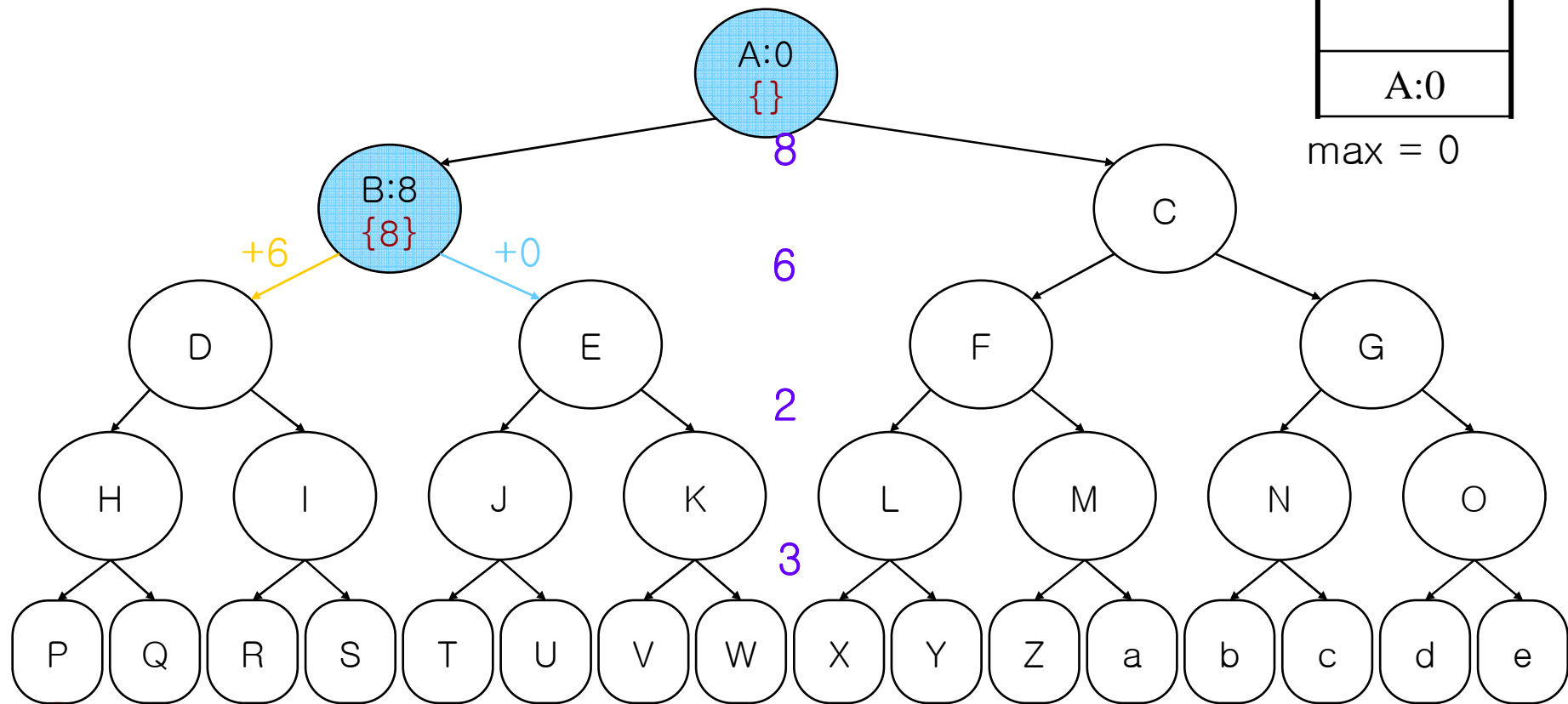
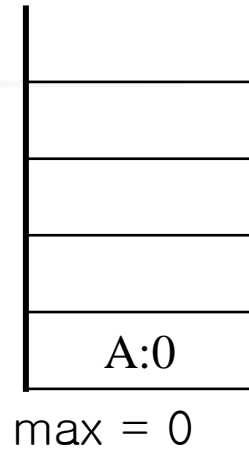
- Backtracking: $n = 4$; $c_1 = 12, c_2 = 9$; $w = [8, 6, 2, 3]$



Push A:0 and Move to B

Container Loading Example (3)

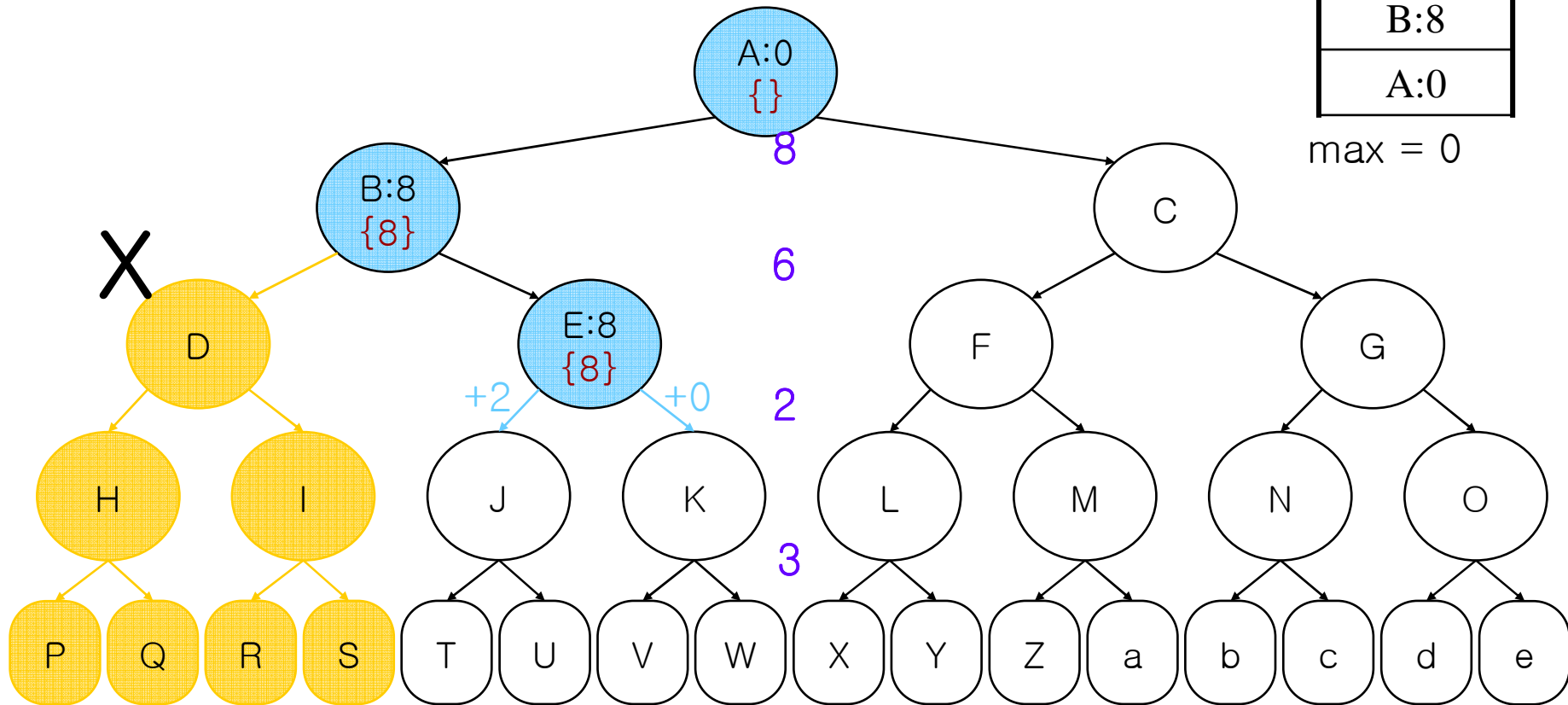
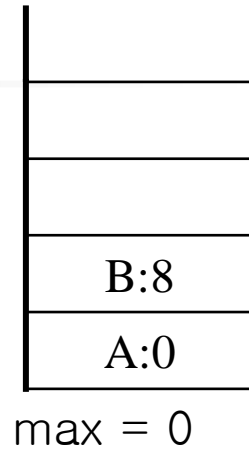
- Backtracking: $n = 4$; $c_1 = 12, c_2 = 9$; $w = [8, 6, 2, 3]$



Push B:8 and Move to E

Container Loading Example (4)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$



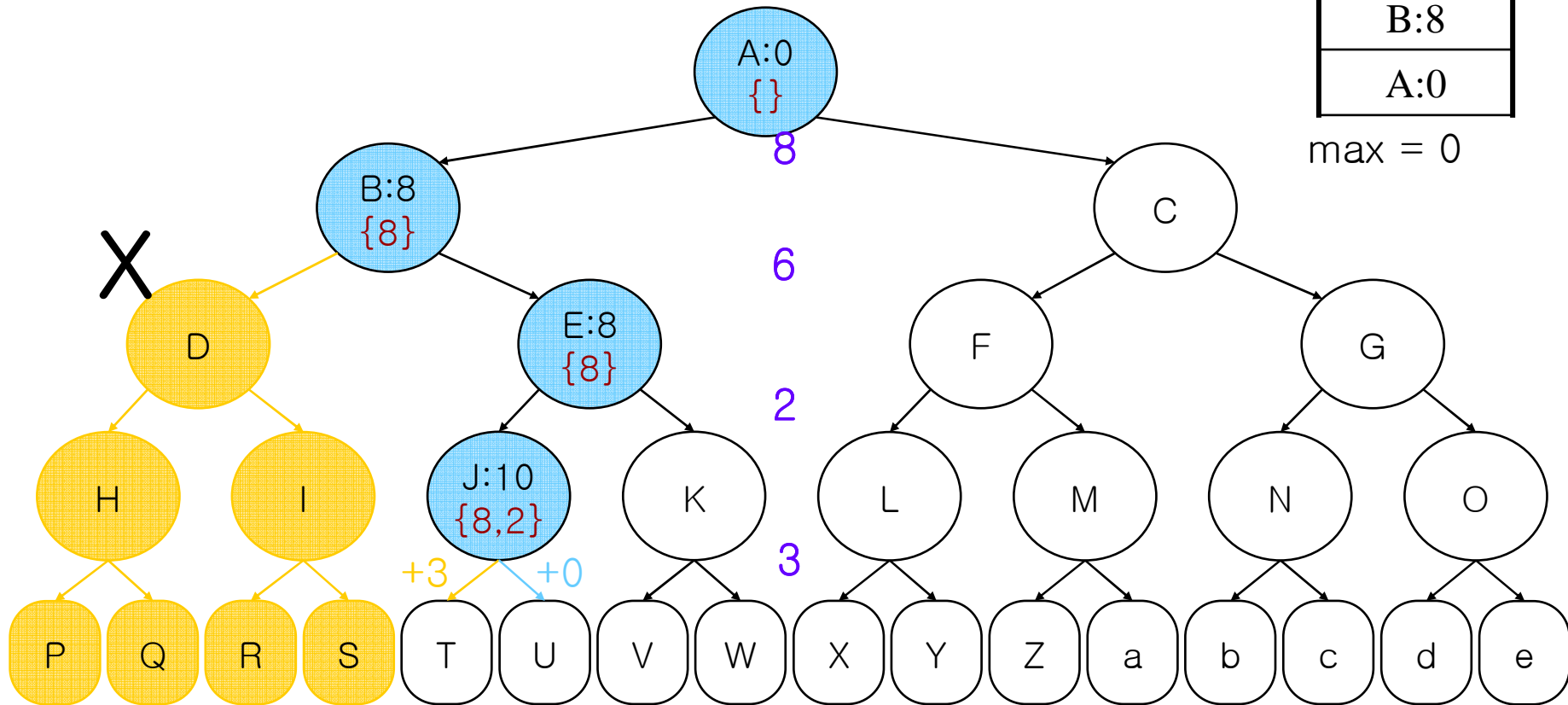
Push E:8 and Move to J

Container Loading Example (5)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$

E:8
B:8
A:0

max = 0



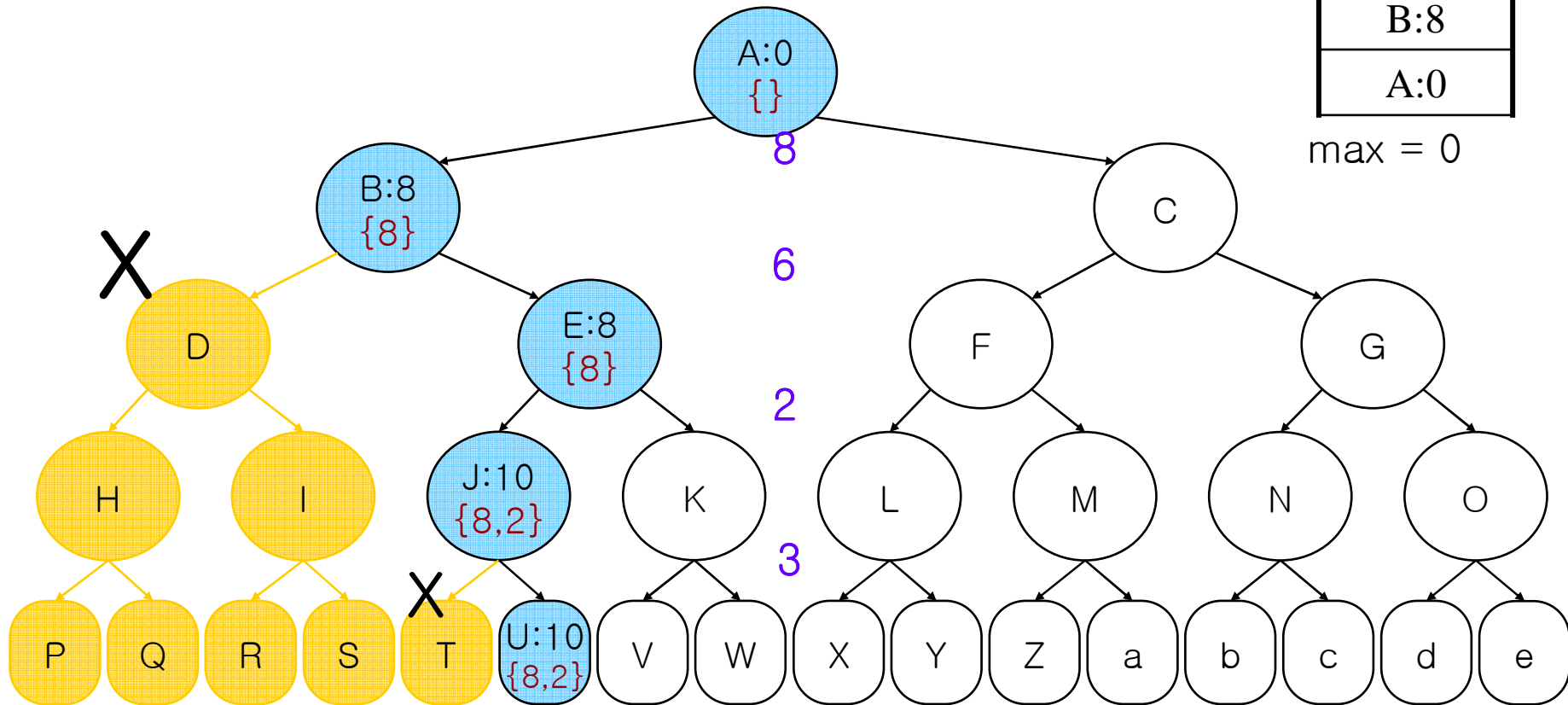
Push J:10 and Move to U

Container Loading Example (6)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$

J:10
E:8
B:8
A:0

max = 0



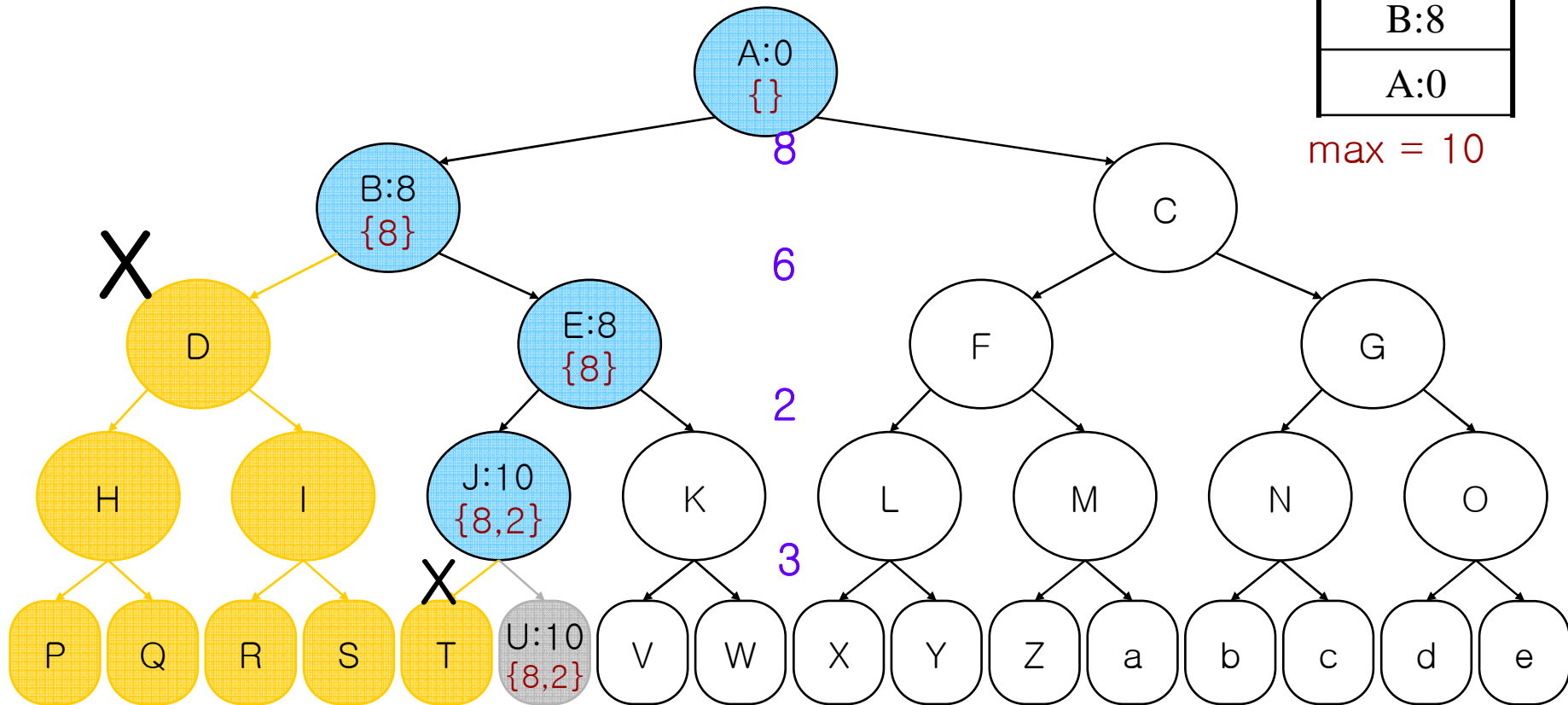
Set max ← 10, Pop J:10 and Backtrack to J

Container Loading Example (7)

- Backtracking: $n = 4$; $c_1 = 12, c_2 = 9$; $w = [8, 6, 2, 3]$

E:8
B:8
A:0

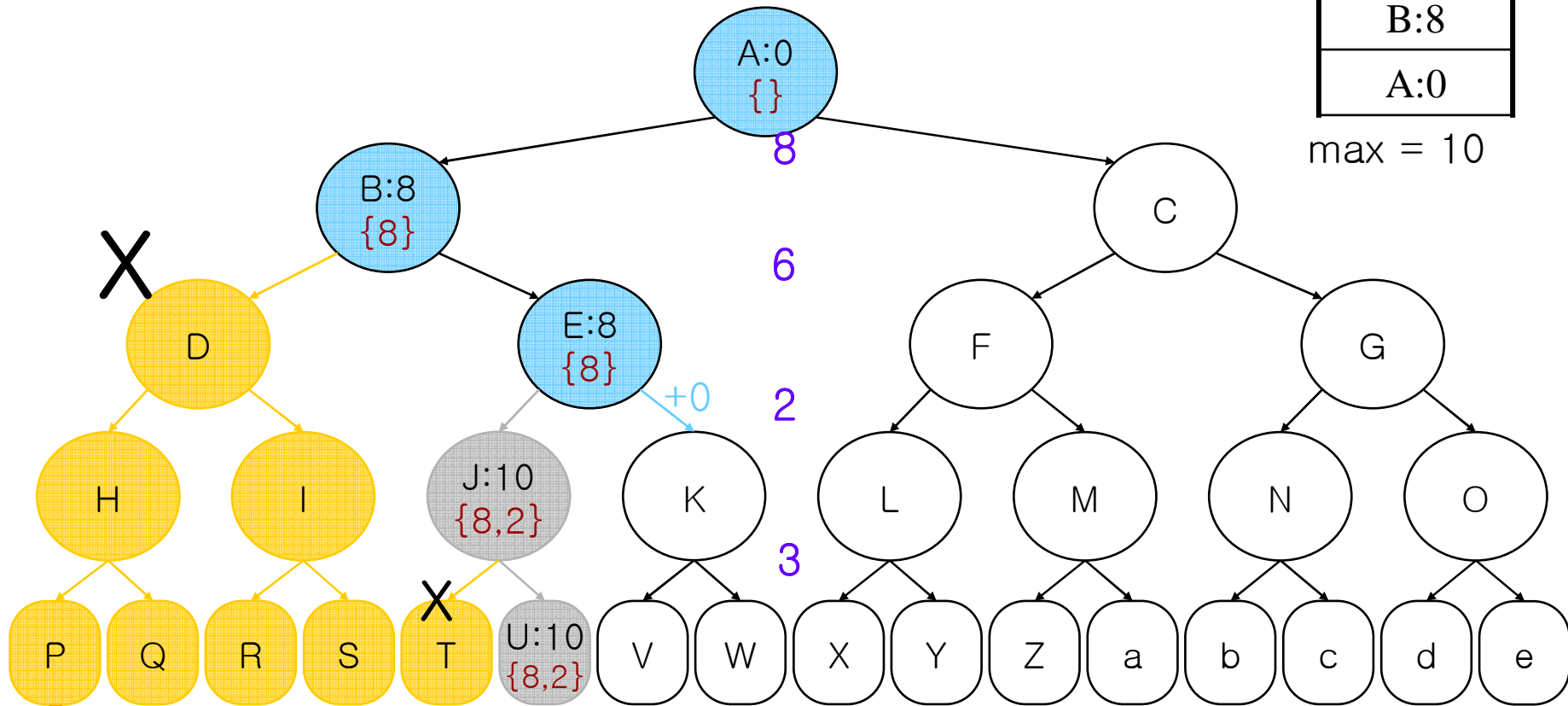
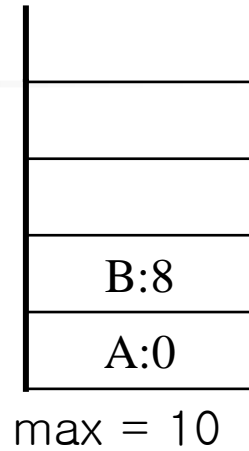
max = 10



Pop E:8 and Backtrack to E

Container Loading Example (8)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$



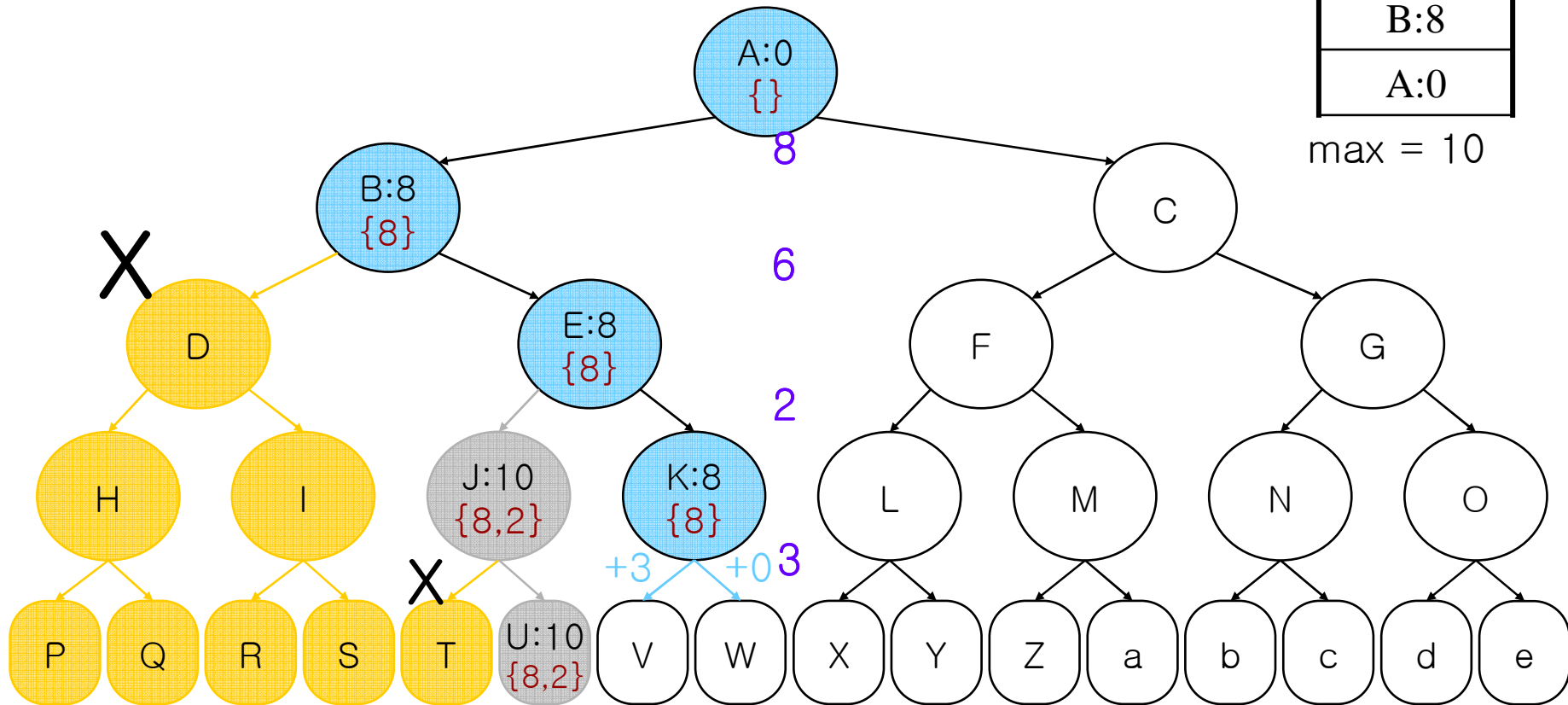
Push E:8 and move to K

Container Loading Example (9)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$

E:8
B:8
A:0

max = 10



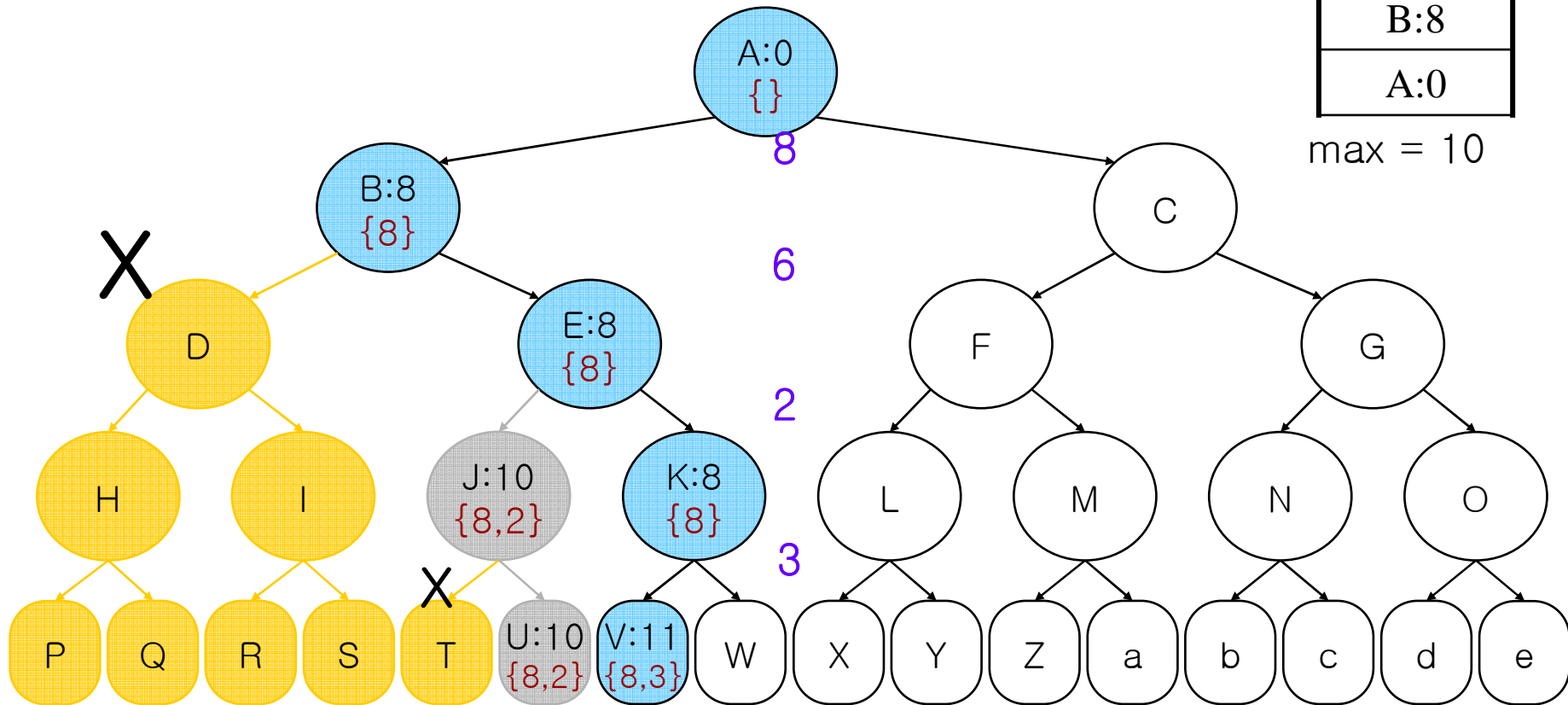
Push K:8 and move to V

Container Loading Example (10)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$

K:8
E:8
B:8
A:0

max = 10



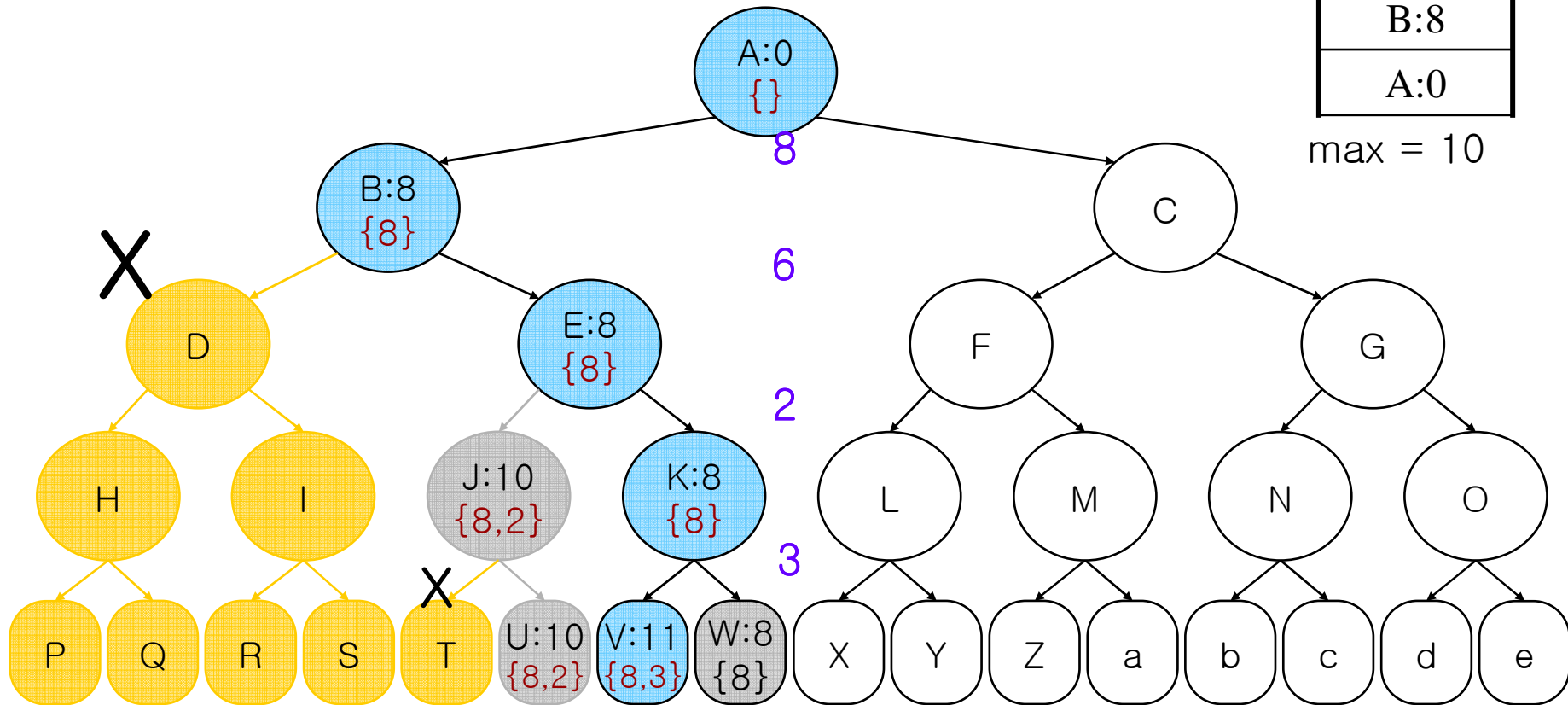
Set max ← 11, pop K:8 and Backtrack to K

Container Loading Example (11)

- Backtracking: $n = 4$; $c_1 = 12, c_2 = 9$; $w = [8, 6, 2, 3]$

E:8
B:8
A:0

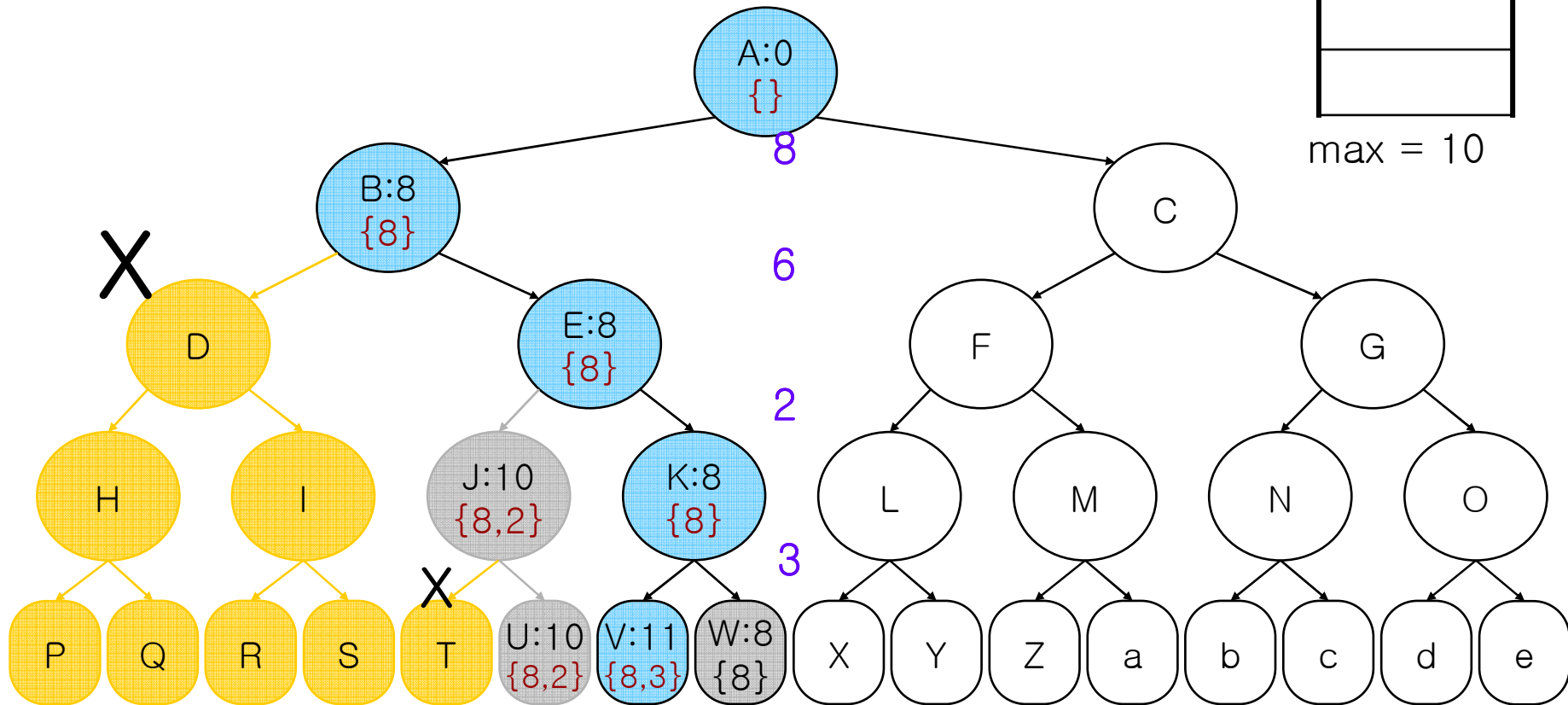
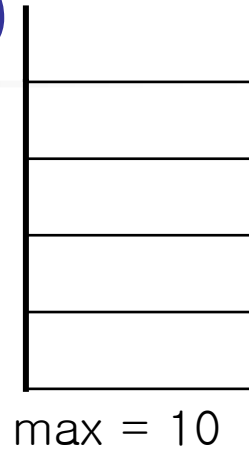
max = 10



pop E:8 & Backtrack to E; pop B:8 & Backtrack to B; pop A:8 & Backtrack to A;

Container Loading Example (12)

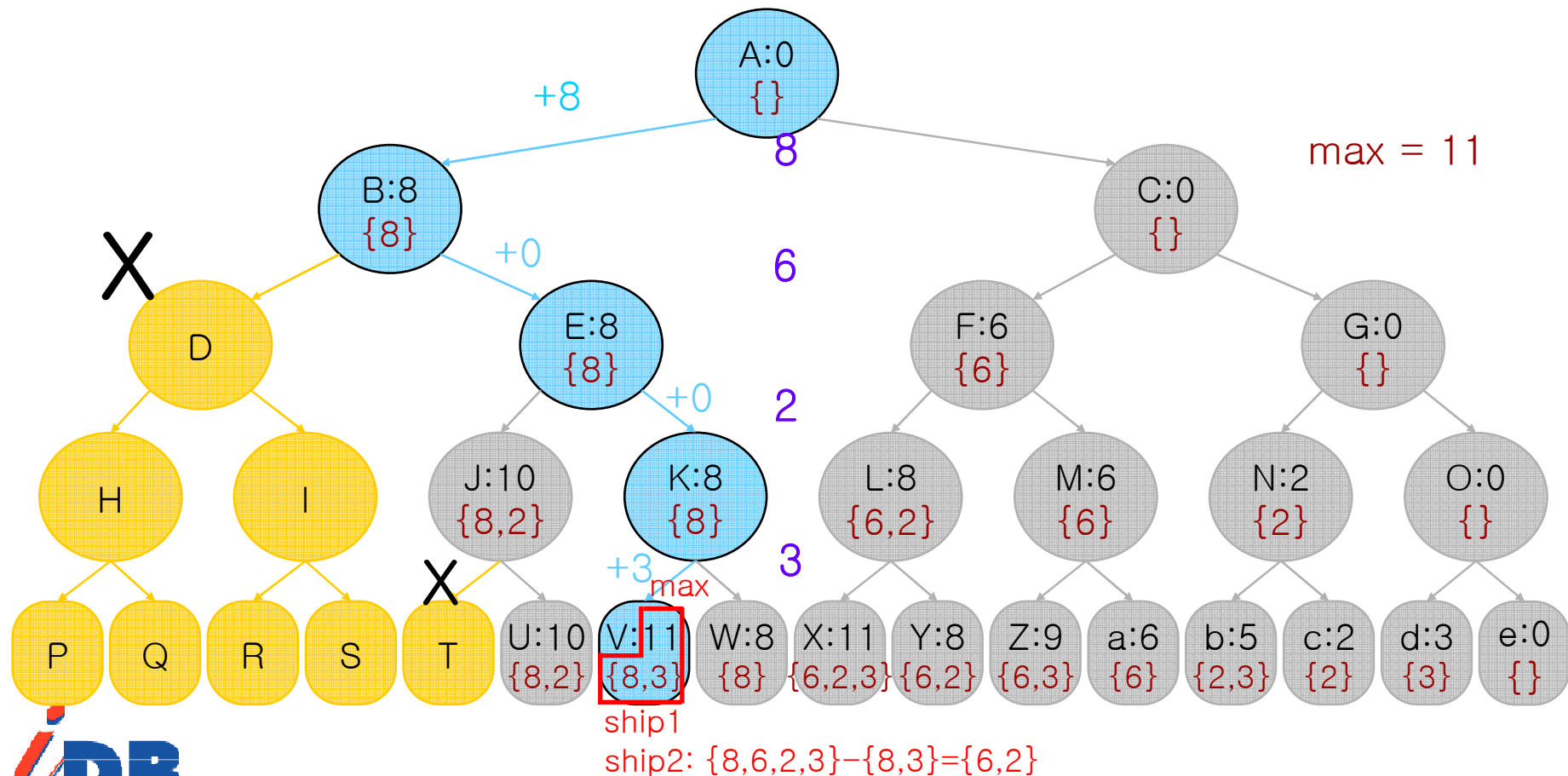
- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$



Process the right subtree of A node with the same previous manner

Container Loading Example (13)

- Backtracking: $n = 4$; $c_1 = 12$, $c_2 = 9$; $w = [8, 6, 2, 3]$





Bird's-Eye View

- A surefire way to solve a problem is to make a list of all candidate answers and check them
 - If the problem size is big, we can not get the answer in reasonable time using this approach
 - List all possible cases → exponential cases
- By a systematic examination of the candidate list, we can find the answer without examining every candidate answer
 - *Backtracking* and *Branch and Bound* are most popular systematic algorithms

** Surefire = 확실한, 특림없는



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