

Chapter 5

Backtracking

Objectives

- Describe the backtrack programming technique
- Determine when the backtracking technique is an appropriate approach to solving a problem
- Define a state space tree for a given problem

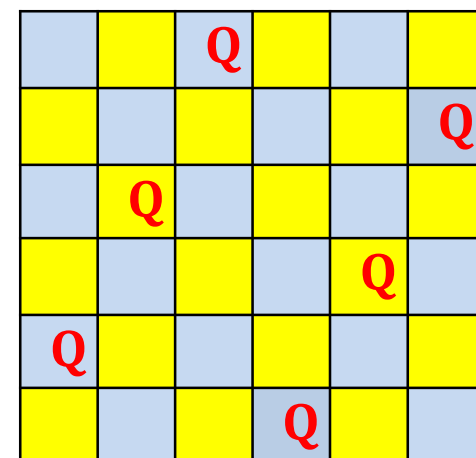
Backtracking vs Dynamic Programming

- Dynamic Programming – subsets of a solution are generated
- Backtracking – Technique for deciding that some subsets need not be generated

5.1 Backtracking Technique

- Problems: a sequence of objects is chosen from a specified set so that the sequence satisfies some criterion.
- The classic example : is in the *n-Queens problem*.

- Goal: is to *position n queens on an $n \times n$ chessboard* so that, no two queens may be in the same row, column, or diagonal.
- The *sequence* in n -queen problem is the *n positions* in which the queens are placed, the *set* for each choice is *the n^2 possible* positions on the chessboard.
- The n -Queens problem is a generalization of its instance when $n = 8$, *which is the* instance using a standard chessboard.
- We will illustrate backtracking using the instance when $n = 4$.



N = 6

depth-first search

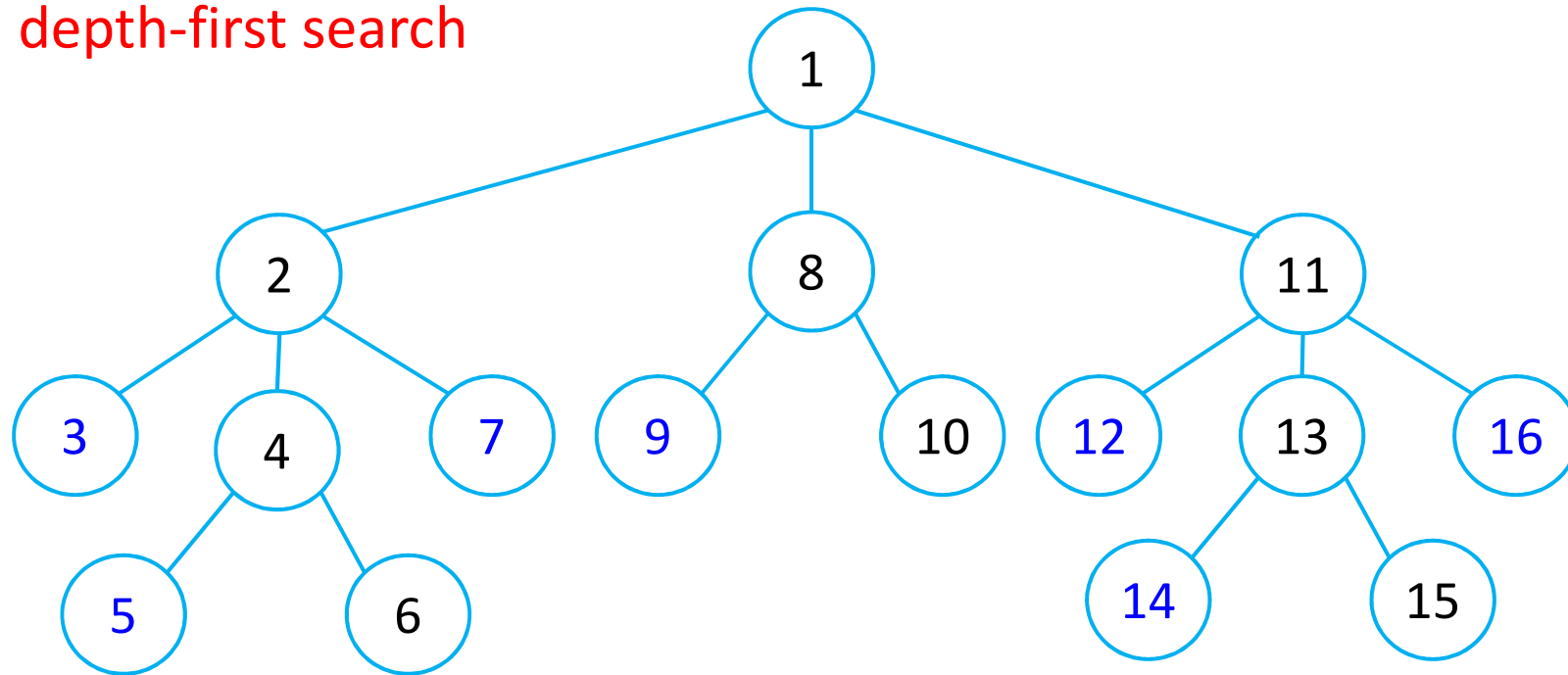


Figure 5.1 depth-first search

- The nodes are numbered in the order in which they are visited.
- path is followed as deeply as possible until a **dead end** is reached.
- At a dead end we back up until we reach a node with an unvisited child, and then we again proceed to go as deep as possible.

- Backtracking is a modified **depth-first search** of a tree
- A ***preorder tree traversal*** is a depth-first search of the tree.
- This means that
 - the **root is visited first**, and
 - a visit to a node is followed **immediately** by visits to all descendants of the node.
- Although a depth-first search does not require that the children be visited in any particular order, we will visit the children of a node from left to right in the applications in this chapter.

Function called by passing **root** at the top level

```
void depth_first_tree_search(node v)
{
    node u;
    visit v;
    for( each child u of v)
        depth_first_tree_searach(u);
}
```

- Consider n queens, $n = 4$.
- To simplify : **no two queens** can be in the same row.
- Assign to each queen a different row and checking which column combinations yield solutions.
- Because each queen can be placed in one of four columns, there are:

$$4 \times 4 \times 4 \times 4 = 256 \text{ candidate solutions}$$

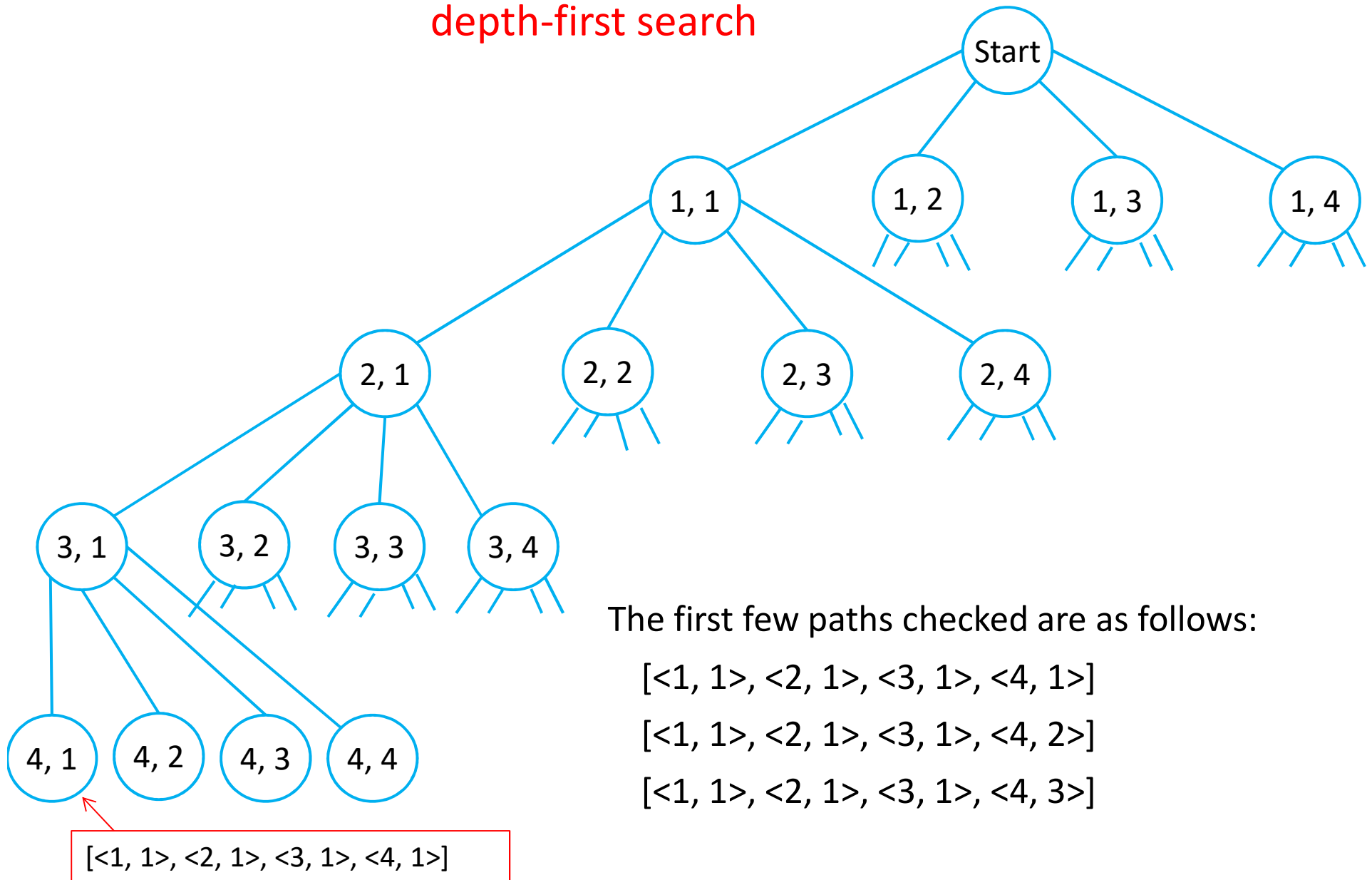
- **Nodes:**

- **Non-promising** node: the node cannot lead to a solution
- **Promising** node: may lead to a solution

- If a node is **non-promising**, backtrack to the node's parent and proceed with the search on the next child

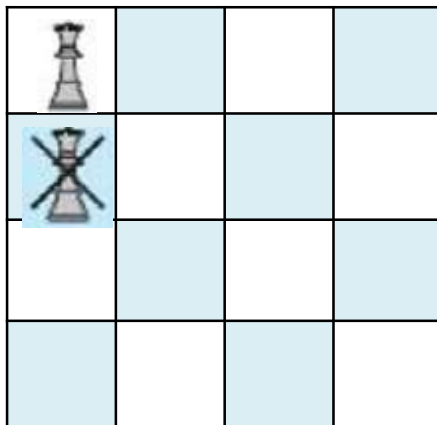
- We can create the candidate solutions by constructing a tree in which the column choices for the **first queen** (the queen in **row 1**) are stored in **level-1** nodes in the tree , the column choices for the **second queen** (the queen in **row 2**) are stored in **level-2** nodes, and so on. This tree is called a ***state space tree***
- A path from the root to a leaf is a candidate solution
- ***The*** entire tree has 256 leaves, one for each candidate solution.

depth-first search

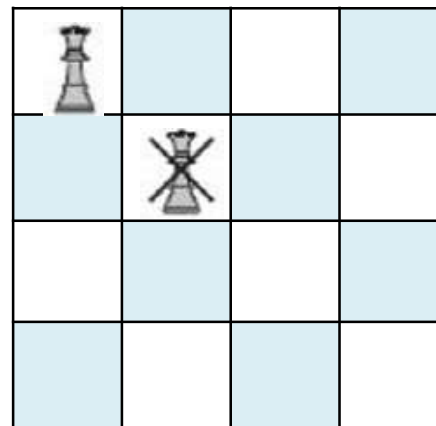


state space tree

- We can make the search more efficient as follows: no two queens can be in the same column.
- This sign tells us that this node can lead to nothing but dead ends.
- Similarly, as illustrated in Fig. 5.3(b) .



(a)



(b)

- Backtracking : a depth-first search of a state space tree, checking whether each node is **promising**
- If it is **nonpromising**, backtracking to the node's parent. This is called ***pruning the state space tree***,
- ***The subtree*** consisting of the visited nodes is called the ***pruned state space tree***.
- A general algorithm for the backtracking :

```

void checknode (node v)
{
    node u;
    if (promising ( v ) )
        if ( there is a solution at v ) write the solution ;
    else
        for ( each child u of v )
            checknode ( u );
}

```

Example 5.1

- *n-Queens problem*: the function *promising* must return false if a node and any of the node's ancestors place queens in the same column or diagonal.

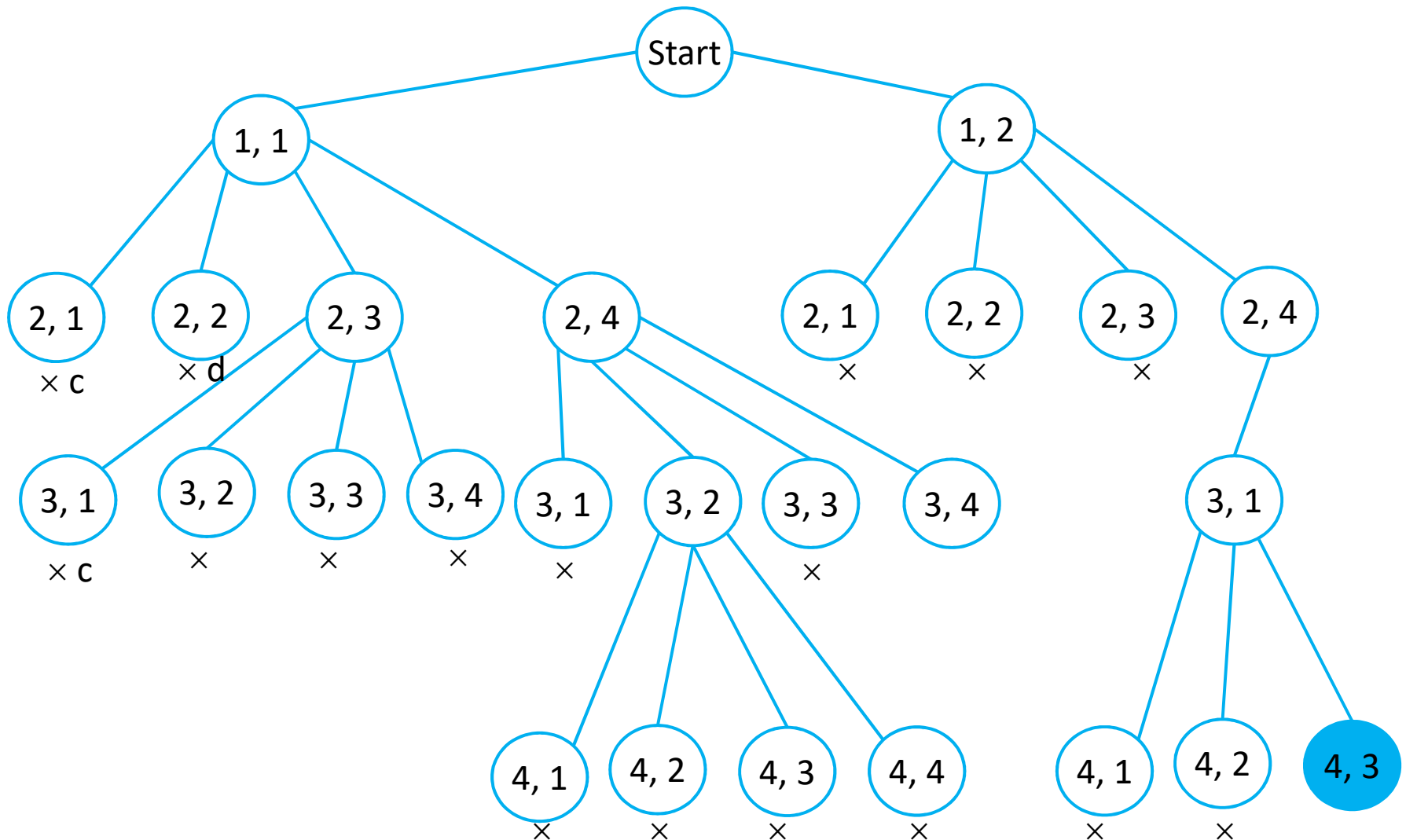













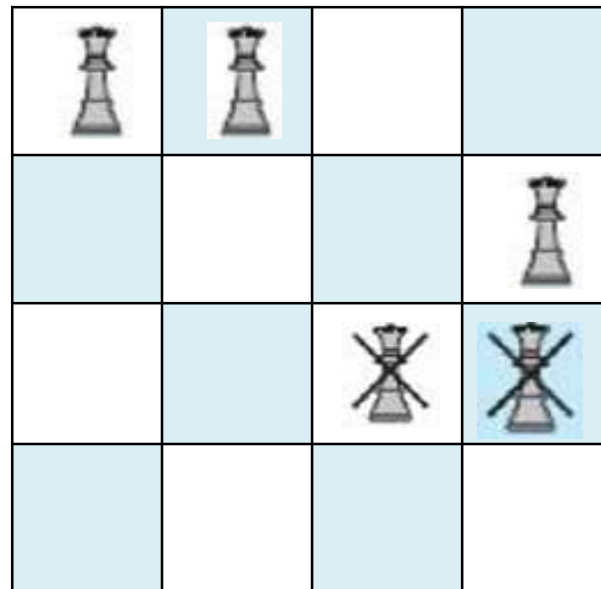


Figure 5.4 shows a portion of the pruned state space tree produced when backtracking is used to solve the instance in which $n = 4$.

- (a) $\langle 1, 1 \rangle$ is promising. { because queen 1 is the first queen positioned }
- (b) $\langle 2, 1 \rangle$ is nonpromising. {because queen 1 is in column 1}
 $\langle 2, 2 \rangle$ is nonpromising. {because queen 1 is on left diagonal }
 $\langle 2, 3 \rangle$ is promising
- (c) $\langle 3, 1 \rangle$ is nonpromising. { because queen 1 is in column 1 }
 $\langle 3, 2 \rangle$ is nonpromising. {because queen 2 is on right diagonal }
 $\langle 3, 3 \rangle$ is nonpromising. {because queen 1 is in column 1 }
 $\langle 3, 4 \rangle$ is nonpromising. {because queen 2 is on left diagonal }
- (d) Backtrack to $\langle 1, 1 \rangle$
 $\langle 2, 4 \rangle$ is promising
- (e) $\langle 3, 1 \rangle$ is nonpromising. {because queen 1 is in column 1 }
 $\langle 3, 2 \rangle$ is promising. {This is the second time we've tried $\langle 3, 2 \rangle$ }



- There is some inefficiency in *checknode*, we check whether a node is promising after passing it to the procedure. This means that activation records for nonpromising nodes are unnecessarily placed on the stack of activation records.
- We could avoid this by checking whether a node is promising before passing it. A general algorithm for backtracking that does this is as follows:

```

void expand (node v)
{
    node u;
    for ( each child u of v )
        if (promising ( u ))
            if ( there is a solution at u )
                write the solution ;
            else
                expand ( u );
}

```

```

void checknode (node v)
{
    node u;
    if (promising ( v ))
        if ( there is a solution at v )
            write the solution ;
        else
            for ( each child u of v )
                checknode ( u );
}

```

5.2 The *n*-Queens Problem

- All solutions to N-Queens problem
- ***col(i)*** : the column where the queen in the *i*th row is located

Promising function:

- 2 queens same column?

$$\text{col}(i) == \text{col}(k)$$

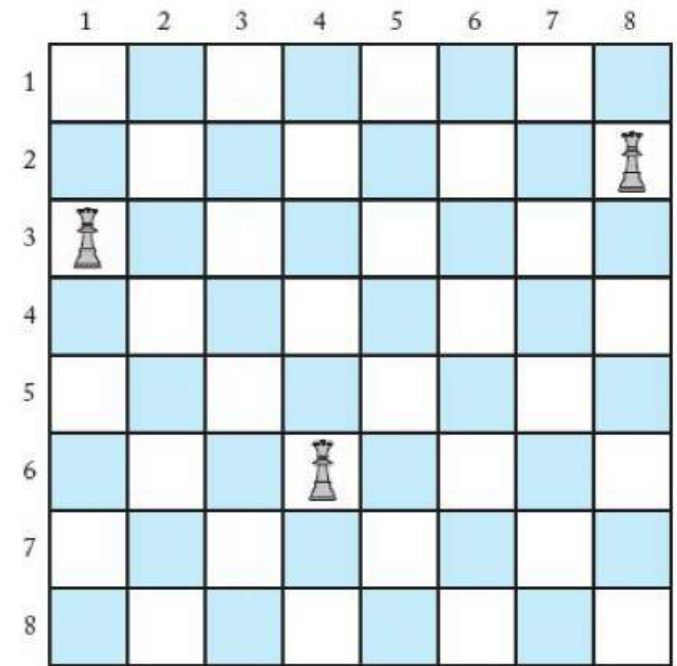
- 2 queens same diagonal?

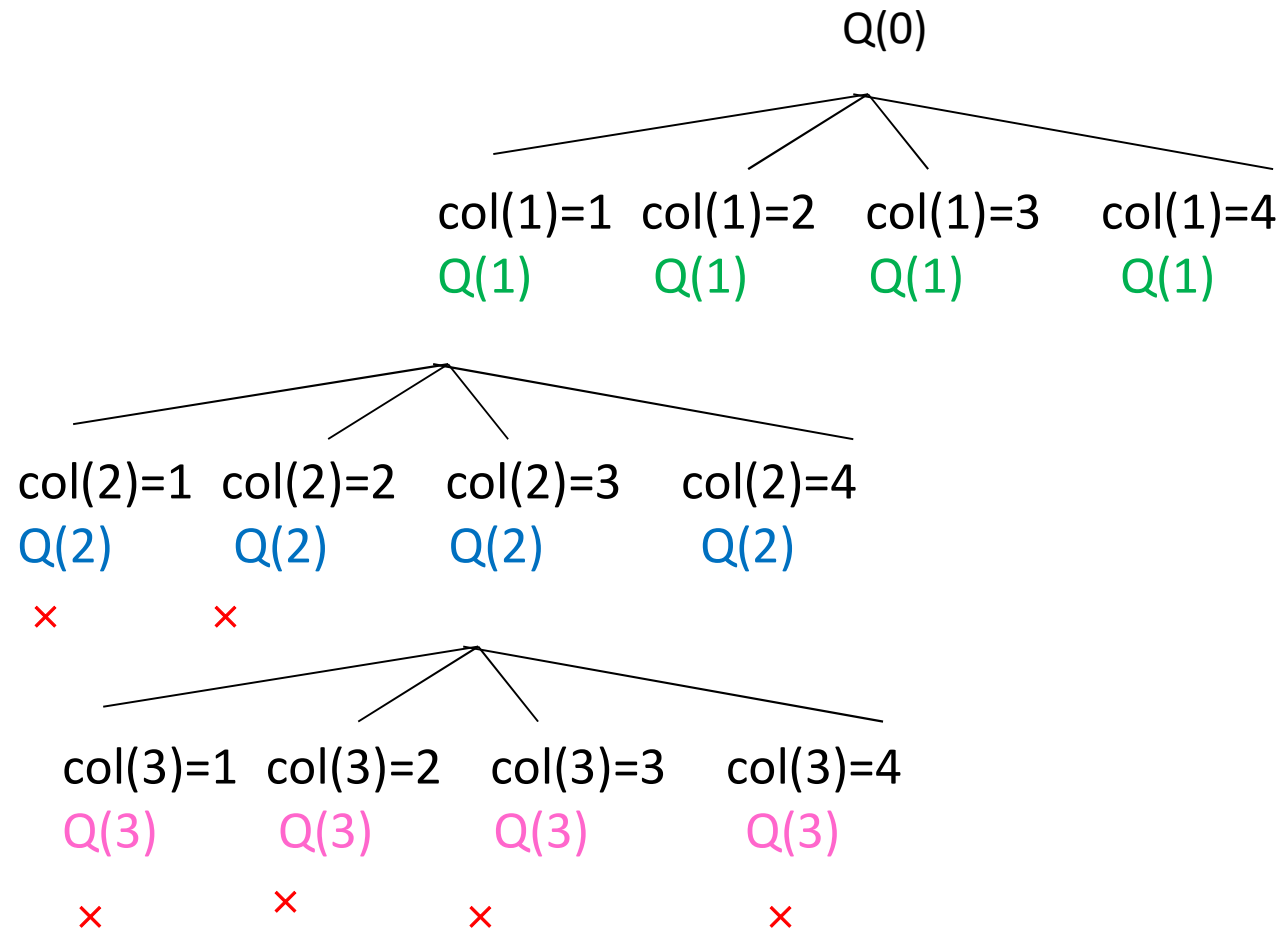
$$\text{col}(i) - \text{col}(k) == i - k \text{ or } \text{col}(i) - \text{col}(k) == k - i$$

$$\text{col}(2)=8, \text{col}(3)=1, \text{col}(6)=4,$$

$$\text{col}(2) - \text{col}(6) = 4 = 6 - 2$$

Figure 5.6 The queen in row 6 is being threatened in its left diagonal by the queen in row 3 and in its right diagonal by the queen in row 2.





Algorithm 5.1

The Backtracking Algorithm for the *n*-Queens Problem

- Problem: Position n queens on a chessboard so that no two are in the same row, column, or diagonal.
- Inputs: positive integer n .
- Outputs: all possible ways n queens can be placed on an $n \times n$ chessboard so that no two queens threaten each other.
- Each output consists of an array of integers *col* indexed from **1** to **n**, ($col[i]$ is the position of the queen in the i th row).

```

void queens ( index i )
{
    if ( promising ( i ))
        if ( i == n )    cout col [ 1 ] through col [ n ]
        else
            for (int j = 1; j <= n; j++){           // see if queen in (i+1) st row
                col [ i + 1 ] = j;                 // can be positioned in each of
                queens ( i + 1 );                   // the nth column
            }
    }
bool promising ( index i )
{
    index k;    bool switch;
    k = 1;    switch = true;
    while ( k < i && switch){                       //check if any queen threatens
                                                    // queen in th ith row
        if ( col [ i ] == col [ k ] || abs ( col [ i ] - col [ k ] ) == ( i - k )    switch = false;
        k++;
    }
    return switch;
}

```

- In Algorithm 5.1, the main routine is *queens*.
- *n* and *col* are not inputs to the recursive routine *queens*.
- *The top-level call to queens : queens(0)*
- In general, the problems in this chapter can be stated to **require one**, several, or all solutions.
- It is a simple modification to make the algorithms stop after finding one solution.

- Upper bound on number of nodes checked in pruned state space tree by counting number of nodes in entire state space tree:

- level 0 : 1 node
- level 1 : n nodes
- level 2 : n^2 nodes. . .
- level n : n^n nodes

- The total number of nodes is

$$1 + n + n^2 + n^3 + \dots + n^n = \frac{n^{n+1} - 1}{n - 1}$$

For the instance in which $n = 8$, the state space tree contains

$$\frac{8^{8+1} - 1}{8 - 1} = 19,173,961 \text{ nodes}$$

- This analysis is of limited value because the whole purpose of backtracking is to avoid checking many of these nodes.

- To obtain an upper bound on the number of promising nodes: **no** two queens can ever be placed in the **same column**.
- For example, consider the instance in which $n = 8$.
- The first queen can be positioned in any of the **eight** columns, the second can be positioned in at most **seven** columns; once the second is positioned, the third can be positioned in at most **six** columns; and so on.

- Therefore, there are at most

$$1 + 8 + 8 \times 7 + 8 \times 7 \times 6 + \dots + 8! = 109\,601 \text{ promising nodes}$$

- Generalizing this result to an arbitrary n ,
 $1 + n + n \times (n-1) + \dots + n! = \text{promising nodes}$
- This analysis does not give us a very good idea as to the efficiency of the algorithm for the following reasons: First, it does not take into account the diagonal check in function *promising*.
- Therefore, there could be far less promising nodes than this upper bound. Second, the total number of nodes checked includes both promising and nonpromising nodes.

- Algorithm 1 : depth-first search without backtracking.
- The number of nodes it checks is the number in the state space tree.
- Algorithm 2 :no two queens can be in the same row or in the same column. Algorithm 2 generates $n!$ candidate solution
- Nqueen, n=8:
 - promo 2057
 - nonpromo 13664

n	Number of Nodes Checked by Algorithm 1 [†]	Number of Candidate Solutions Checked by Algorithm 2 [‡]	Number of Nodes Checked by Backtracking	Number of Nodes Found Promising by Backtracking
4	341	24	61	17
8	19,173,961	40,320	15,721	2057
12	9.73×10^{12}	4.79×10^8	1.01×10^7	8.56×10^5
14	1.20×10^{16}	8.72×10^{10}	3.78×10^8	2.74×10^7

Algorithm 5.4 Backtracking Algorithm for Sum-of-Subsets

- **Sum-of-Subsets problem:** there are n positive integers (weights) w_i and a positive integer W .
- The goal is to find all subsets of the integers that sum to W .

Example 5.2

- $S = \{w_1 = 5, w_2 = 6, w_3 = 10, w_4 = 11, w_5 = 16\}$ and $W=21$
- Solutions:
 - $\{w_1, w_2, w_3\} : 5 + 6 + 10 = 21$
 - $\{w_1, w_5\} : 5 + 16 = 21$
 - $\{w_3, w_4\} : 10 + 11 = 21$

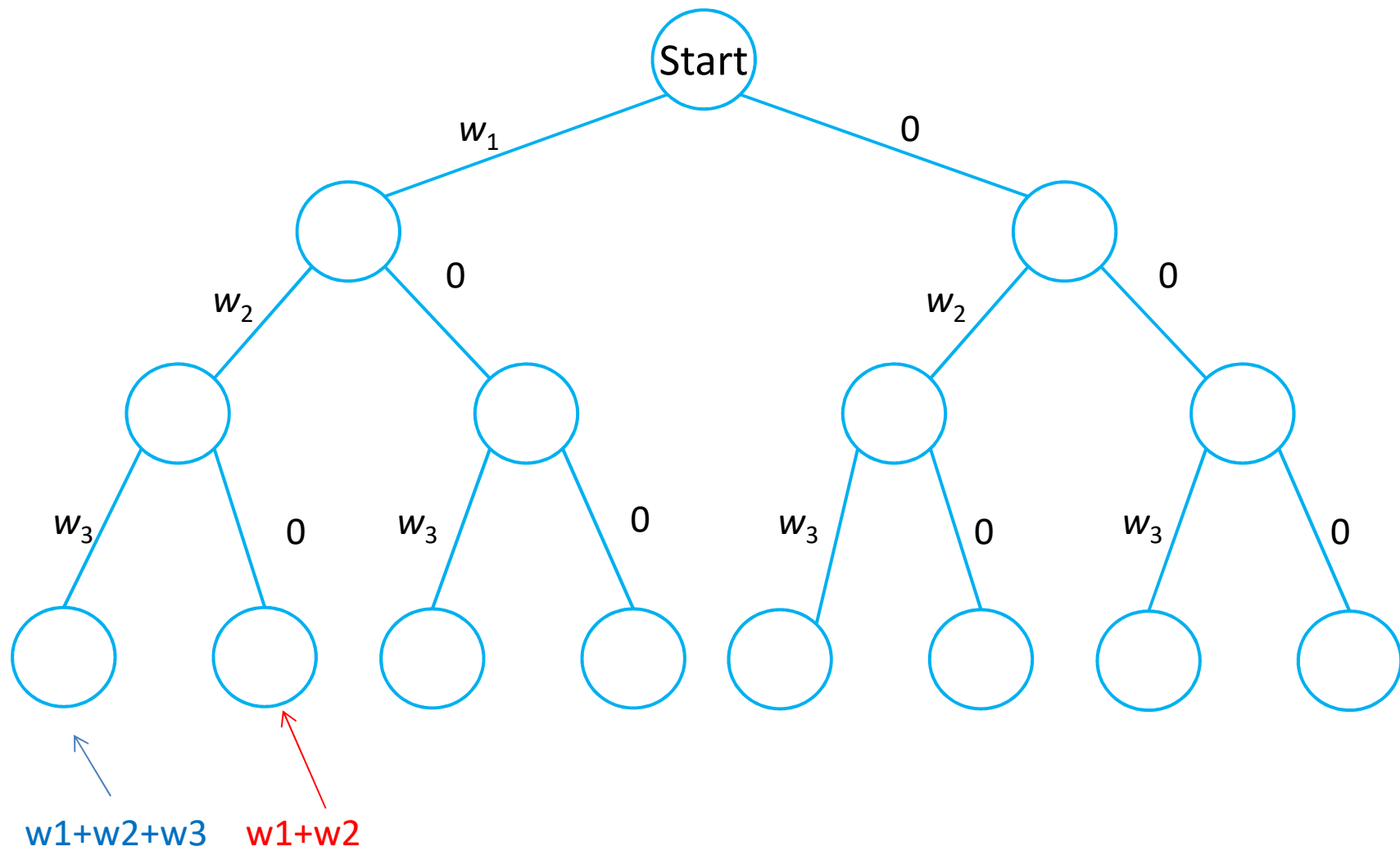
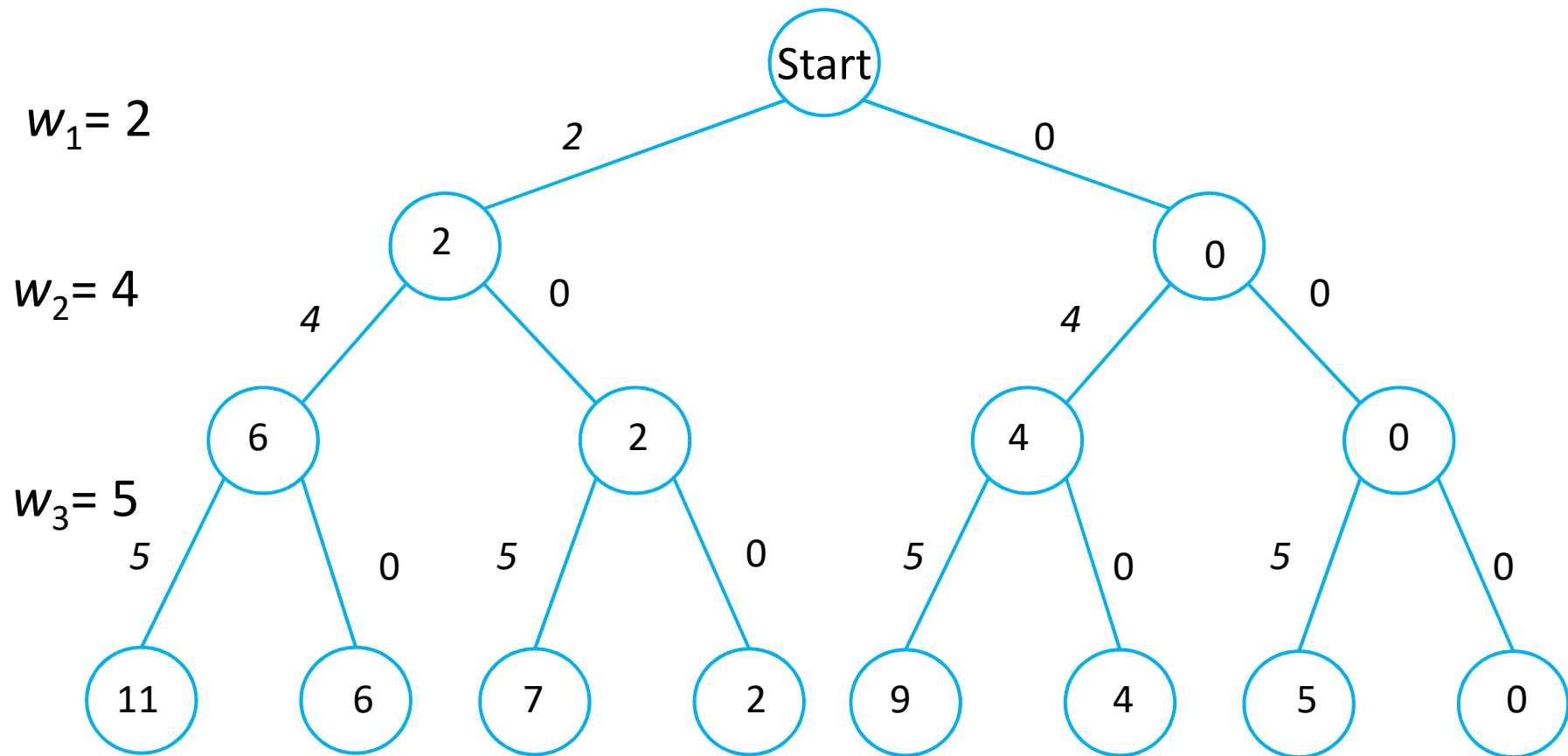


Figure 5.7 A state space tree for instances of the Sum-of-Subsets problem in which $n = 3$.

Example 5.3

- $n = 3$, $W = 6$, $w_1 = 2$, $w_2 = 4$, $w_3 = 5$

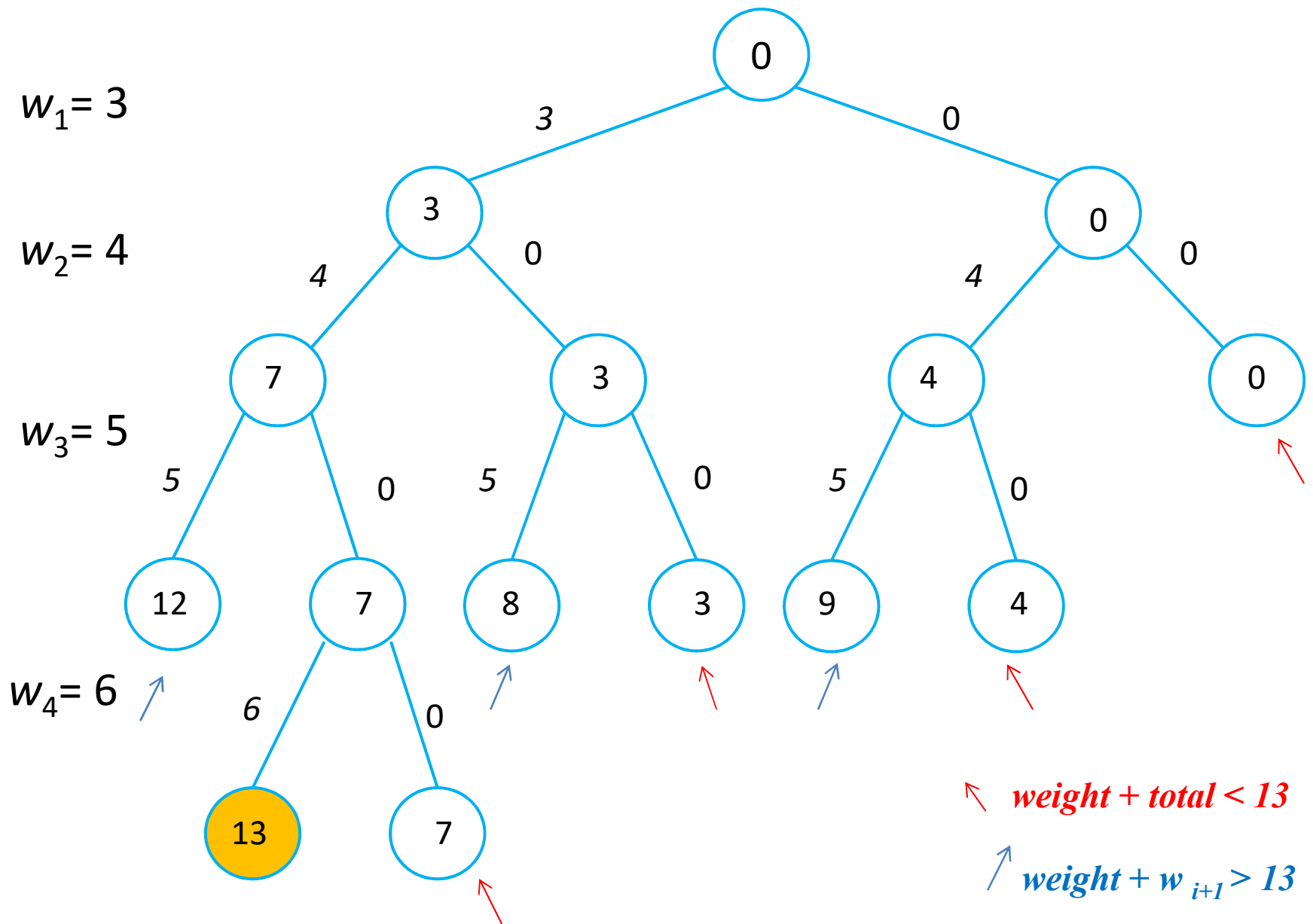


$$Weight + w_{i+1} > W$$

- Sort weights in **non-decreasing** order before search
- **weight** : the sum of weights that have been included up to a node at level ***i***.
- **total** : the total weight of the remaining weights at a given node.
- node at level ***i*** is non-promising if **$weight + w_{i+1} > W$**
- A node is non-promising if **$weight + total < W$**

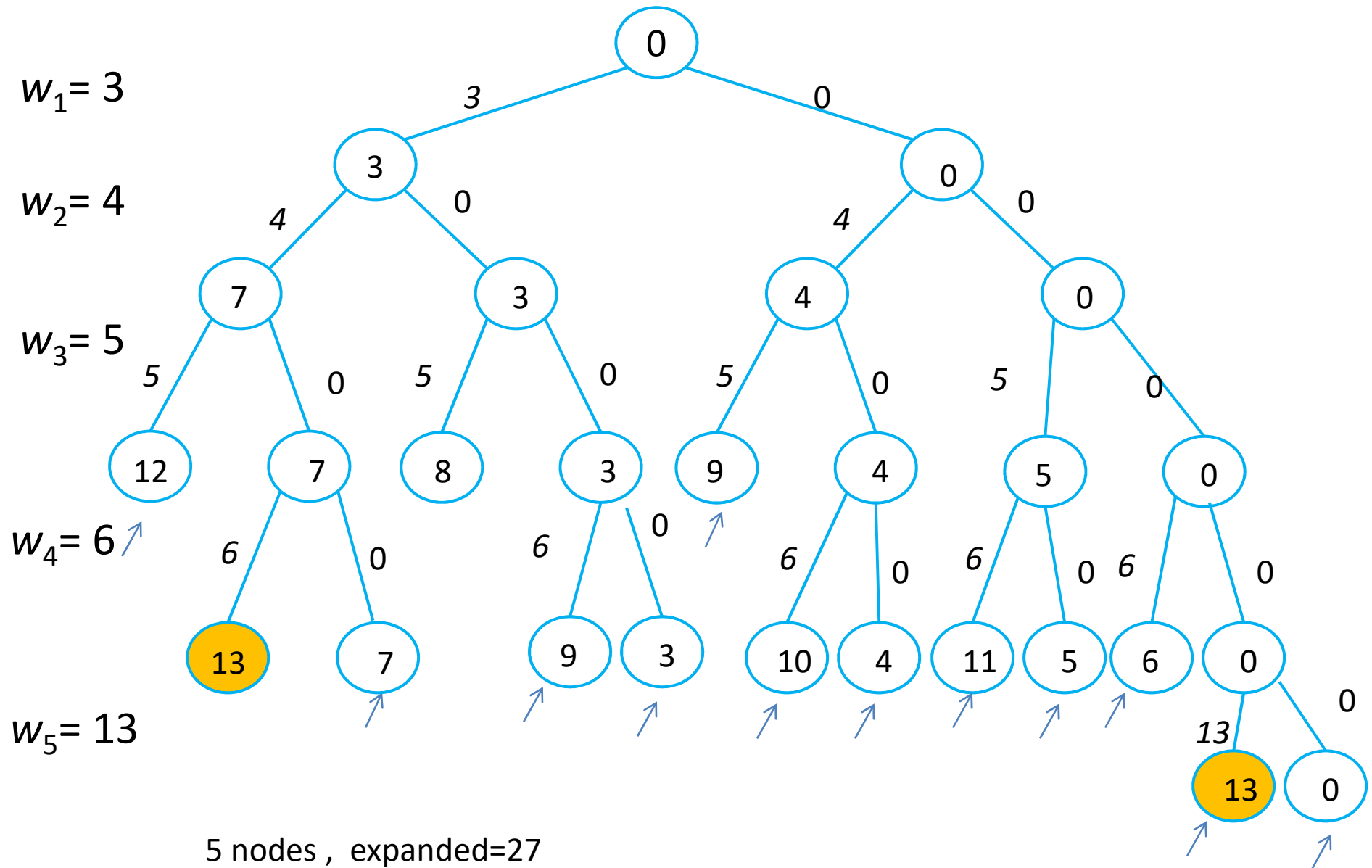
Example 5.4

- Figure 5.9 shows the pruned state space tree when backtracking is used with $n = 4$, $W = 13$, and $w_1 = 3$, $w_2 = 4$, $w_3 = 5$, $w_4 = 6$





5 nodes , expanded=15
 $2^{n+1} - 1 = 2^5 - 1 = 31$

$n = 13$, $W = 13$, and , $w_1 = 3$, $w_2 = 4$, $w_3 = 5$, $w_4 = 6$, $w_5 = 13$



5 nodes , expanded=27

$$2^{n+1} - 1 = 2^6 - 1 = 63$$

 $weight + total < 13$
 $weight + w_{i+1} > 13$

Algorithm 5.4

The Backtracking Algorithm for the Sum-of-Subsets Problem

- Problem: Given n positive integers (weights) and a positive integer W , determine all combinations of the integers that sum to W .
- Inputs: positive integer n , *sorted* (nondecreasing order) array of positive integers w indexed from 1 to n , and a positive integer W .
- Outputs: all combinations of the integers that sum to W .

```

bool promosing (index i, int weight, int total)
{
    return( weight + total >= W) && ( weight == W || weight + w [ i + 1 ] <= W );
}

```

```

void sum_of_subsets (int i, int weight, int total )
{
    if (promosing (i, weight, total))
        if (weight == W)
            cout << include[1] through cout << include[k]
        else {
            include [ i + 1 ] = "yes";
            sum_of_subsets (i+1, weight + w [ i + 1 ], total - w [ i + 1 ] );
            include[i+1]="no";
            sum_of_subsets ( i + 1, weight, total - w [ i + 1 ] );
        }
}

```

First call: Sum-of-Subsets(0, 0, total), $total = \sum_{j=1}^n w[j]$

- The total number of nodes in the state space searched by Algorithm 5.4

$$1 + 2 + 2^2 + \dots + 2^n = 2^{n+1} - 1$$

- It could be that for every instance only a small portion of the state space tree is searched.
- This is not the case. For each n , *it is possible to* construct an instance for which the algorithm visits an exponentially large number of nodes.