# CS580 Algorithm Design, Analysis, and Implementation

Lecture notes, Jan 25, 2022 *Wufei Ma* 

### **1** Search Trees

**Binary tree.** Each node has two children, which could be empty. It also has a parent, which could also be empty.

- A node without any children (both empty) is a **leaf** node.
- The node without a parent is a **root** node.
- $\gamma$  is a **descendant** of  $\mu$  if  $\gamma$  is a child of  $\mu$  or a descendant of a child of  $\mu$ .
- If  $\gamma$  is a descendant of  $\mu$ , then  $\mu$  is an **ancestor** of  $\gamma$ .
- The **depth** of  $\mu$  is the number of edges from root to  $\mu$ .
- The **height** of  $\mu$  is the max number of edges from  $\mu$  to a leaf.
- The **subtree** of  $\mu$  consists of  $\mu$  and its descendant.

A node can be implemented with three node pointers and a key, and a tree can be represented by a node.



Figure 1: A binary tree.

**Traversals.** There are three types of traversals, in-order, pre-order, and post-order.

```
1 Procedure In-Order(u):
2 if u != null then:
3 In-Order(u.l)
4 print(u.key)
5 In-Order(u.r)
6 endif
```





Figure 2: Tree traversals.

**A property.**  $\mu$  is an ancestor of  $\gamma$  if and only if  $pre(\mu) < pre(\gamma)$  and  $post(\mu) > post(\gamma)$ .



Figure 3: A property.

**Binary search tree.** A binary tree is a **binary search tree** if the keys printed in-order is sorted.

All operations on binary search tree, including Search, Min, Successor, and Insertion, are in O(h).

#### Searching.

```
1
      Function Search(x, u):
2
          if u == null or x = u.key then:
3
              return u
4
          else:
5
               if x < u.key then:
6
                  return Search(x, u.l)
7
               else:
8
                  return Search(x, u.r)
```

#### **Insertion**.

```
1
       Procedure Insert(p, r):
 2
            # insert r into a tree denoted by p
 3
            x = null
 4
            u = p
 5
            while u != null:
 6
               x = u
 7
                if r.key < u.key then:</pre>
 8
                   u = u.l
 9
                else:
10
                   u = u.r
11
                endif
12
            endwhile
13
            r.p = x
14
            if x == null then:
15
               p = r
16
            else:
17
                if r.key < x.key then:</pre>
18
                   x.l = r
19
                else:
20
                   x.r = r
21
                endif
22
            endif
```

#### **Deletion**.

- 1. Case I: The node has no children. Just delete this node.
- 2. Case II: The node has one child. Replace with the child.
- 3. **Case III:** The node has two children. Replace the key with its successor. Delete its successor. (The successor has at most one child).



Figure 4: Deletion.

## 2 Dynamic Programming

Algorithmic paradigms.

- Greedy
- Divide-and-conquer
- Dynamic programming

Weighted interval scheduling. Job *j* starts at  $s_j$ , finishes at  $f_j$ , and has weight (or value)  $v_j$ . Two jobs are compatible if they don't overlap. The goal is to find the maximum weight subset of mutually compatible jobs.



Figure 5: Weighted interval scheduling.

If all weights are 1, the greedy algorithm works, and we pick the job with the earliest finish time that is compatible with chosen jobs.

Without loss of generality, we assume  $f_1 \leq \cdots \leq f_n$ . Let p(j) be the largets index i < j such that job i is compatible with j. Let OPT(j) be the value of optimal solution to the problem consisting of jobs  $1, \ldots, j$ .

- **Case I:** OPT selects job *j*. We collect profit  $v_j$  and OPT(p(j)).
- **Case II:** OPT does not select job *j*. We collect profit OPT(j-1).

We have

$$OPT(j) = \begin{cases} 0 & \text{if } j = 0\\ \max\{v_j + OPT(p(j)), OPT(j-1)\} & \text{otherwise} \end{cases}$$

**Implementation.** Store results of sub-problems in a cache to avoid computing subproblems multiple times. This algorithm takes  $O(n \log n)$  time.

- Sort by finish time:  $O(n \log n)$
- Computing  $p(\cdot)$ :  $O(n \log n)$  via sorting by start time
- Running time of OPT is only O(n)