

# DATA STRUCTURE AND ALGORITHM

## CLASS 7

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TREE



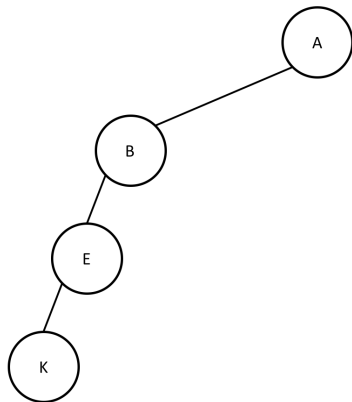
**Tree** It is finite set of one or more nodes such that

1. there is a special node called root
2. remaining nodes are partitioned into *n* disjoint trees  $T_1, T_2, \dots, T_n$  where each of these is a tree; we call each  $T_i$  subtree of the root

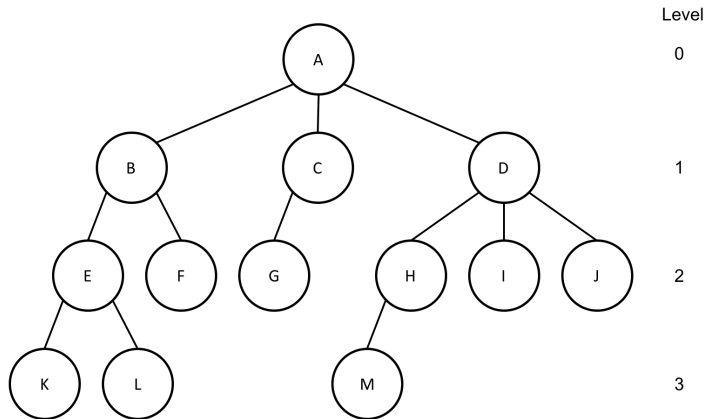
**Acyclic graph** A tree that contains no cycle

It has a hierarchical structure

# Tree



# Tree

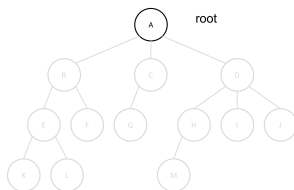


# TERMINOLOGY

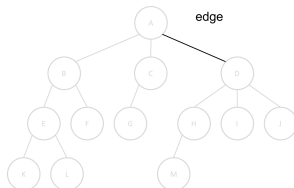


# Terminology I

**Root** A node with no parent (e.g., A is the root)



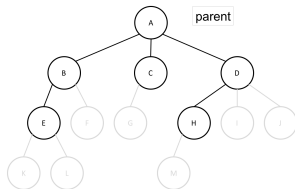
**edge** The connecting link between any two nodes (e.g., link between A and B is edge)



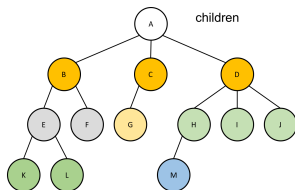


# Terminology II

**parent** a node that has subtrees (e.g., A is parent of B, C, and D. E is parent of K and L)

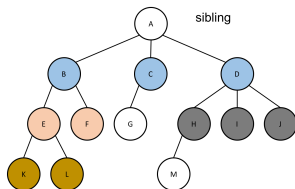


**child** a root of the subtrees (e.g., E is child of B, C is child of A)

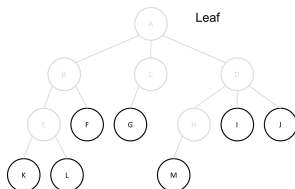


# Terminology III

**sibling** child nodes of the same parent (e.g., B, C, and D are siblings, K, L, and M are siblings)



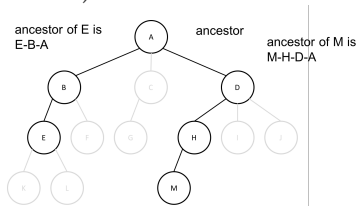
**Leaf (terminal, external) node** A node with degree zero (e.g., K, L, F, G, M, I, and J)



# Terminology IV

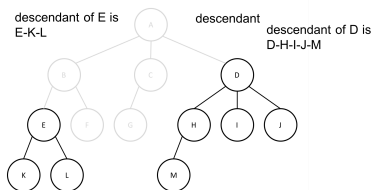
**Internal (non-terminal, internal) node** node with degree one or more  
(e.g., A, B, C, D, E, and H)

**ancestor** all the nodes along the path from the root to the node  
(e.g., ancestor of K is K, E, B, and A. Ancestor of H is H, D, and A)



# Terminology V

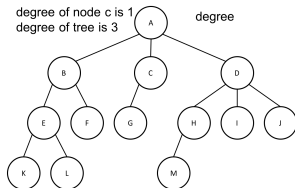
**descendant** all the nodes that are in its subtrees (e.g., Descendants of E is E, K, and L. Descendants of D is D, H, M, I, and J)



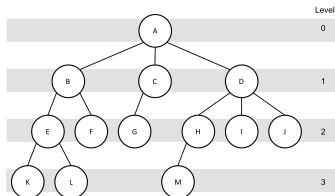
**Degree of a node** The number of subtrees of node, in other words the total number of children of a node (e.g., Degree of A is 3. Degree of C is 1)

# Terminology VI

**Degree of a tree** The maximum degree of the nodes in the tree (e.g., the degree of the tree is 3)



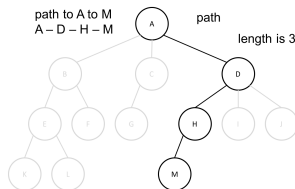
**level** each step from top to bottom, the level of the root node is 0 (e.g., level of F is 2. Level of M is 3)



# Terminology VII

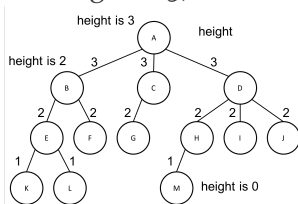
**path** the set of edges from the root to a node (e.g., the path to M from A is (A, D), (D, H), (H, M))

**path length** The number of edges in a path (e.g., path length from A to M is 3)



# Terminology VIII

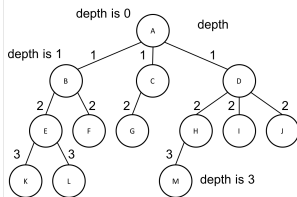
**Height of a tree** The longest path length from the root to a leaf (e.g., the height is 3)



# Terminology IX

**depth** the total number of edges from root node to a particular node (e.g., depth of F is 2. Depth of M is 3)

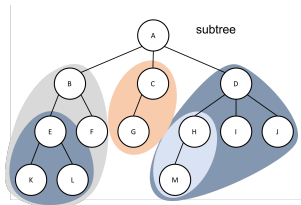
**depth of the tree** the total number of edges from root node to a leaf node in the longest path (e.g., depth of the tree is 3)



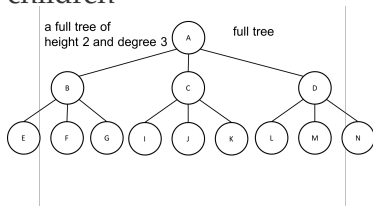


# Terminology X

**subtree** each child from a node forms a subtree recursively. Every child node will form a subtree on its parent node

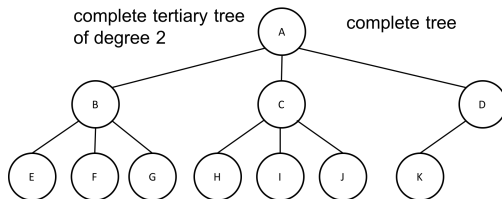


**proper (or full) tree** every node other than the leaves has non-void children



# Terminology XI

**complete tree** All levels are full except for the deepest level, which is partially filled from the left



# TREE REPRESENTATION

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# Tree Data Structure

Two types of representation of tree

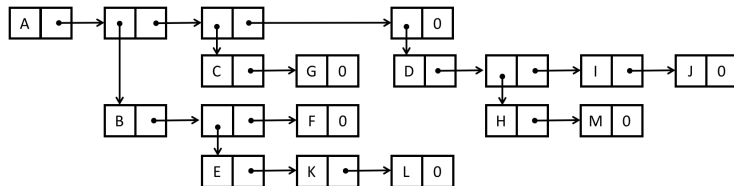
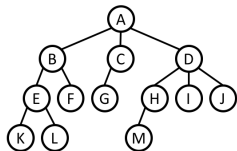
1. List representation
2. left child - right sibling representation

# List Representation

Two types of nodes

1. Node with data
2. Node with the reference

The information in the root node comes first and it is followed by a list of the subtrees of that node



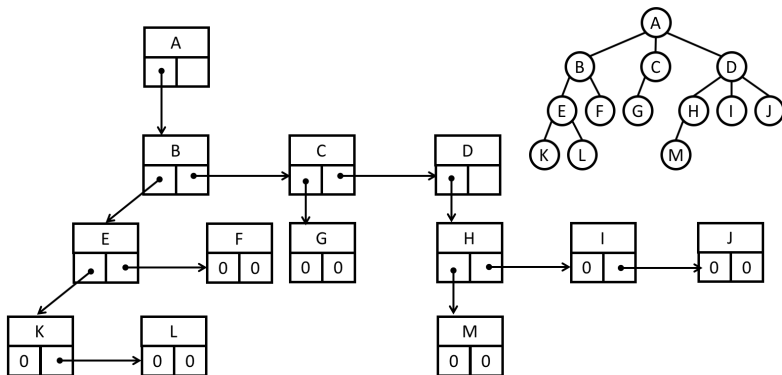
# Left-child Right-Sibling Representation

nodes of a fixed size

- easier to work
- two link / pointer fields and a data field per node
  - left reference field stores the address of the left child
  - right reference field stores the address of the right sibling node



# Left-child Right-sibling Representation

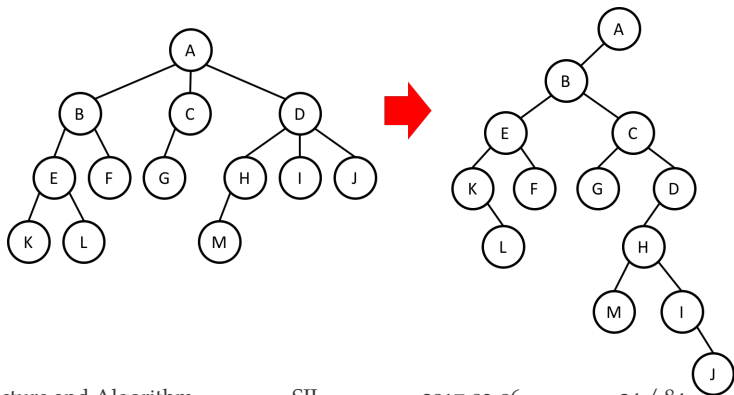


# Representation of trees

Changing a representation of a tree as a degree two tree

- simply rotate the left-child right-sibling tree clockwise by 45 degrees

A tree with degree 2 (two children, left and right child) is called a binary tree





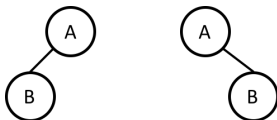
# BINARY TREE



# Definition

A binary Tree is a finite set of nodes such that

1. empty or
2. consists of root node and two disjoint binary trees, called left subtree and right subtree



**Figure:** two different types of binary tree

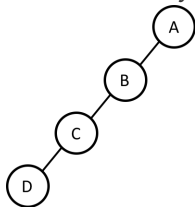
# Properties

## Difference between a binary tree and a tree

- may have empty node
- the order of subtree are important
- a binary tree is not a subset of a tree
- maximum number of nodes in a Binary Tree is  $2^k - 1$  where  $k$  is depth of the tree
- relationship between the number of leaf nodes ( $n_0$ ) and the number of nodes with degree 2 ( $n_2$ )  $n_0 = n_2 + 1$

# Special Types of Binary Trees I

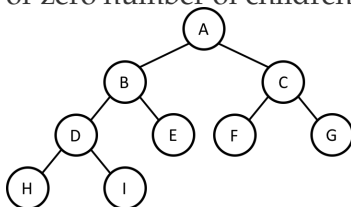
- skewed binary tree



# Special Types of Binary Trees II

- full binary tree (of depth  $k$ )

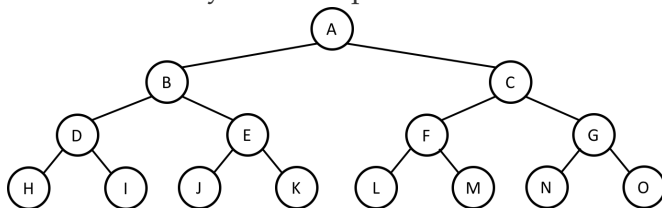
**full (or proper or strictly binary tree** every node has either two or zero number of children



# Special Types of Binary Trees III

- complete binary tree

**complete (or perfect) binary tree** A binary tree in which every internal node has exactly two children and all leaf nodes are at same level a binary tree with  $n$  nodes that correspond to the nodes numbered from 1 to  $n$  in the full binary tree of depth  $k$



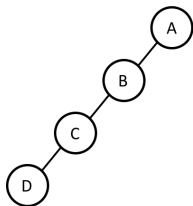
# Binary Tree Representation

There are two methods to represent the binary tree

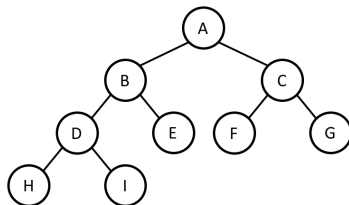
1. Array Representation
2. Linked List Representation

# Array Representation

- sequential representations
- determine the locations of the parent, left child, and right child of any node  $i$  in the binary tree
  1. parent ( $i$ ) is at  $\lfloor i/2 \rfloor$  if  $i \neq 1$ , if  $i = 1$ , no parent
  2. left\_child ( $i$ ) is at  $2 \cdot i$  if  $2i \leq n$
  3. right\_child ( $i$ ) is at  $2 \cdot i + 1$  if  $2 \cdot i + 1 \leq n$



1	A
2	B
3	-
4	C
5	-
6	-
7	-
8	D
9	-
10	-
11	-
12	-
13	-
14	-
15	-
16	E



1	A
2	B
3	C
4	D
5	E
6	F
7	G
8	H
9	I



# The Problem of Array Representation of Tree

- inefficient storage utilization  
 $S(n) = 2^k - 1$  where  $k$  is depth of binary tree  
ideal for complete binary trees
- hard to insert/delete

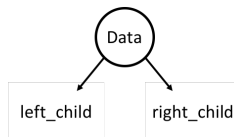
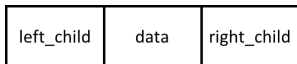
# Linked List representation

## Representing tree with linked list

- each node has three fields

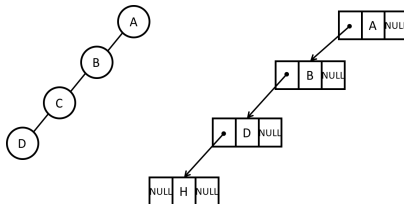
1. left\_child
2. data
3. right\_child

```
1 typedef struct BinaryTreeNode {  
2     int data;  
3     struct BinaryTreeNode* left_child;  
4     struct BinaryTreeNode* right_child;  
5 } node;
```

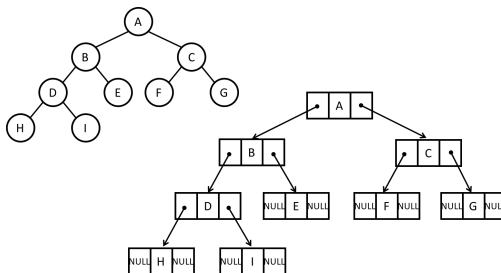


# example

Skewed

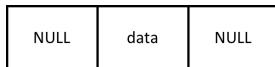


complete

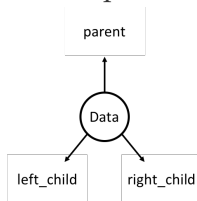
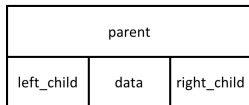


# Linked List Representation cont'd

leaf node's link field contains NULL pointer



Add a fourth field, called parent, to know the parent of a random nodes



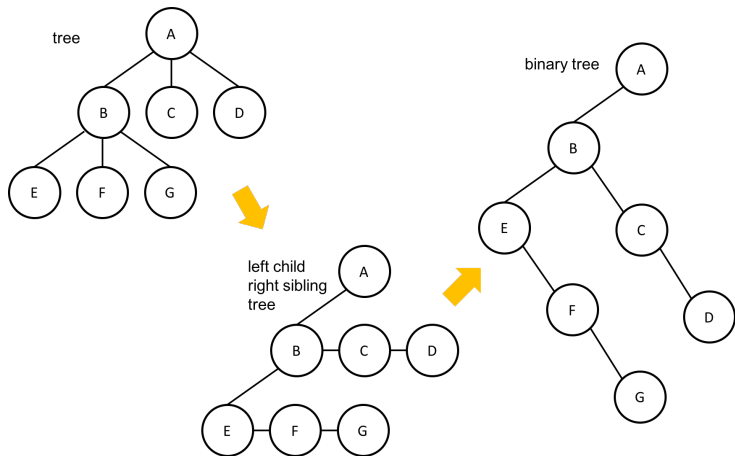
# Tree Representation

- each node in a tree has a variable sized nodes
- hard to represent it by using array
- use linked list to represent a tree needs  $k$  link fields per node
  - $k$  is the degree of tree
- There are two types of links
  - non-null links
  - null links
- if the number of non-null links are  $n - 1$ 
  - the number of null links are  $n \cdot k - (n - 1)$

# Converting a tree into a binary Tree

1. Use left-child right sibling representation
  - $(\text{parent}, \text{child}_1, \text{child}_2, \dots, \text{child}_x) \rightarrow (\text{parent}, \text{leftmost-child}, \text{next-right-sibling})$
2. simply rotate the left-child right-sibling tree clockwise by 45 degrees
  - right field of root node always have null link
  - null links: approximately 50%
  - depth increased

# Converting a tree into a binary Tree



# BINARY TREE TRAVERSAL AND OTHER OPERATIONS

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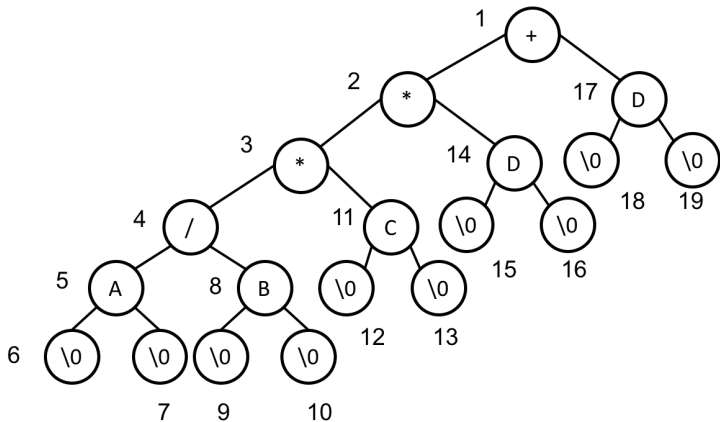
# Binary Tree Traversals

visit each node in the tree exactly once

- produce a linear order for the information in a tree
- what order?
  - inorder: LVR (Left Visit Right)
  - preorder: VLR (Visit Left Right)
  - postorder: LRV (Left Right Visit)

# Binary Tree Traversals

$A/B * C * D + E$  (infix form)



# Binary Tree Traversals

## Inorder Traversal

```
1 void inorder(TreeNode *ptr) {  
2     if(ptr) {  
3         inorder(ptr->left_child);  
4         printf("%d",ptr->data);  
5         inorder(ptr->right_child);  
6     }  
7 }
```

inorder is invoked 19 times for the complete traversal: 19 nodes

output:  $A/B * C * D + E$

- corresponds to the infix form

# Binary Tree Traversal

call of in-order	value in root	action
1	+	
2	*	
3	*	
4	/	
5	A	
6	NULL	
5	A	printf
7	NULL	
4	/	printf
8	B	
9	NULL	
8	B	printf
10	NULL	
3	*	printf

call of in-order	value in root	action
11	C	
12	NULL	
11	C	printf
13	NULL	
2	*	printf
14	D	
15	NULL	
14	D	printf
16	NULL	
1	+	printf
17	E	
18	NULL	
17	E	printf
19	NULL	

# Preorder Traversal

```
1 void preorder(TreeNode *ptr) {  
2     if(ptr) {  
3         printf("%d",ptr->data);  
4         preorder(ptr->left_child);  
5         preorder(ptr->right_child);  
6     }  
7 }
```

output in the order  $+ ** / ABCDE$

# Postorder Traversal

```
1 void postorder(TreeNode *ptr) {  
2     if(ptr) {  
3         postorder(ptr->left_child);  
4         postorder(ptr->right_child);  
5         printf("%d", ptr->data);  
6     }  
7 }
```

output in the order  $AB/C * D * E +$

# Iterative Inorder Traversal

## Recursion

- call itself directly or indirectly
- simple, compact expression: good readability
- don't need to know implementation details
- much storage: multiple activations exist internally
- slow execution speed
- application: factorial, Fibonacci number, tree traversal, binary search, tower of Hanoi, quick sort, LISP structure

# Iterative Inorder traversal

```
1 void iter_inorder(tree_ptr node) {
2     int top = -1;
3     tree_ptr stack[MAX_STACK_SIZE];
4     while (1) {
5         while (node) {
6             push(&top, node);
7             node = node->left_child;
8         }
9         node = pop(&top);
10        if (!node) break;
11        printf("%d", node->data);
12        node = node->right_child;
13    }
14 }
```



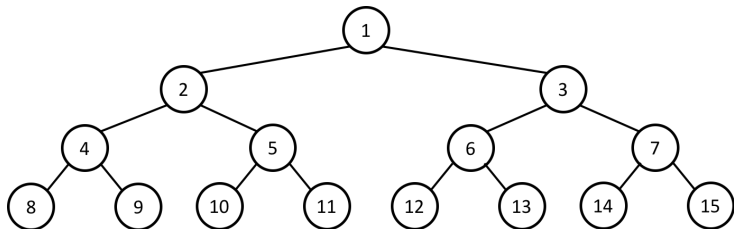
# Iterative Inorder Traversal

every node of the tree is placed on and removed from the stack exactly once

- time complexity:  $O(n)$  where  $n$  is the number of nodes in the tree
- space complexity: stack size  $O(n)$  where  $n$  is worst case depth of the tree (case of skewed binary tree)

# Level Order Traversal

Traversal by using queue (FIFO)



Output in the order: 1, 2, 3, 4, ..., 14, 15

# Level Order Traversal

```
1 void level_order(tree_ptr ptr) {
2     int front = rear = 0;
3     tree_ptr queue[MAX_QUEUE_SIZE];
4
5     if (!ptr) return;
6
7     addq(front,&rear,ptr);
8
9     while (1) {
10         ptr = deleteq(&front, rear);
11
12         if (ptr) {
13             printf("%d", ptr->data);
14             if (ptr->left_child)
15                 addq(front,&rear,ptr->left_child);
16             if (ptr->right_child)
17                 addq(front,&rear,ptr->right_child);
18             else break;
19         }
20     }
21 }
```

# Copying Binary Tree

## Modified version of postorder

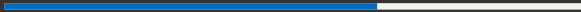
```
1  tree_ptr copy(tree_ptr original) {
2      tree_ptr temp;
3      if (original) {
4          temp = (tree_ptr)malloc(sizeof(node));
5
6          if (IS_FULL(temp)) exit(1);
7          temp->left_child = copy(original->left_child);
8          temp->right_child = copy(original->right_child);
9          temp->data = original->data;
10         return temp;
11     }
12     return NULL;
13 }
```

# Testing for equality of binary trees

## Modified version of preorder

```
1  int equal(tree_ptr first, tree_ptr second) {
2  return ((!first && !second) ||
3          (first && second
4           && (first->data == second->data)
5           && equal(first->left_child,
6                   second->left_child)
7           && equal(first->right_child,
8                   second->right_child));
9  }
```

HEAPS



# Heaps: Definition

**MAX (or MIN) Tree** a tree in which the key value in each node is no smaller (larger) than the key value in its children (if any)

**MAX (or MIN) Heap** a complete binary tree that is also a max (or min) tree

- the root of a max (or min) tree contains the largest (smallest) key in the tree

# Representation of MAX (or MIN) heaps

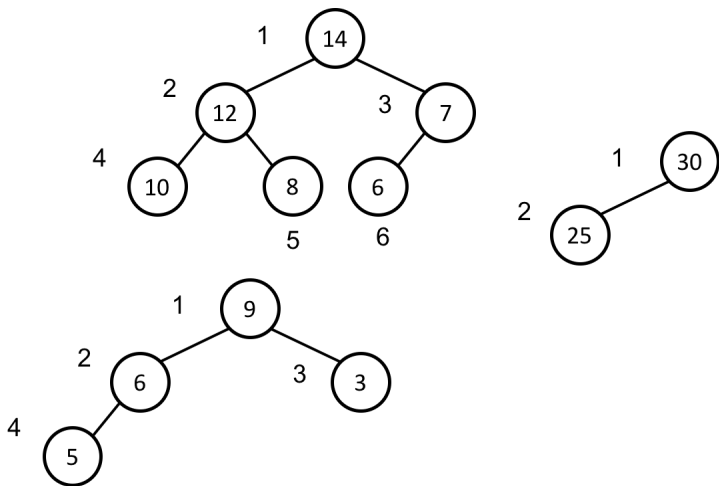
- array representation because heap is a complete binary tree
- simple addressing scheme for parent, left(right) child



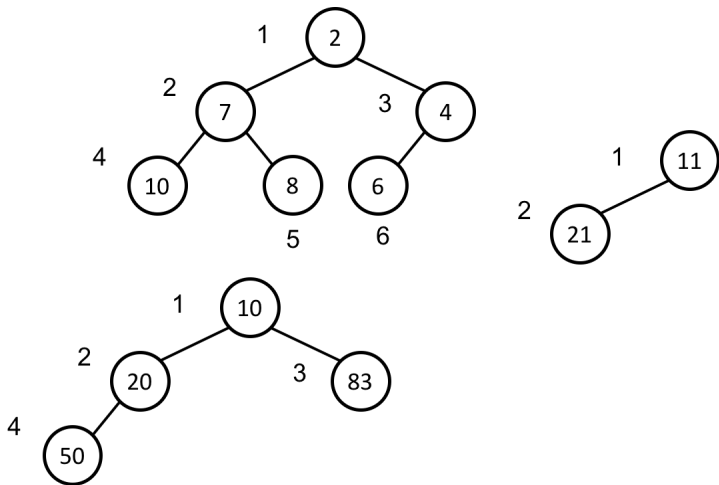
# Heap Structure

```
1  #define MAX_ELEMENTS 200
2  #define HEAP_FULL(n) (n == MAX_ELEMENTS - 1)
3  #define HEAP_EMPTY(n) (!n)
4
5  typedef struct {
6      int key;
7      /* other field */
8  } element;
9
10 element heap[MAX_ELEMENTS];
11 int n = 0;
```

# Sample Max Heaps



# Sample Min Heaps



# Priority Queues

**deletion** deletes the element with the highest(or the lowest) priority

**insertion** insert an element with arbitrary priority into a priority queue at any time

Ex. Job scheduling of OS

# Priority Queues

We use a max (or Min) Heap to implement the Priority Queues

Possible priority queue representations

Representation	insertion	deletion
unordered array	$O(1)$	$O(n)$
unordered linked list	$O(1)$	$O(n)$
sorted array	$O(n)$	$O(1)$
sorted linked list	$O(n)$	$O(1)$
max heap	$O(\log_2 n)$	$O(\log_2 n)$

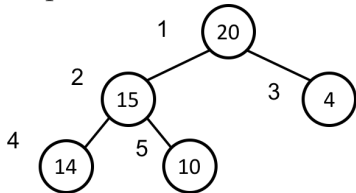
# Insertion into a max heap

Need to go from a node to its parent

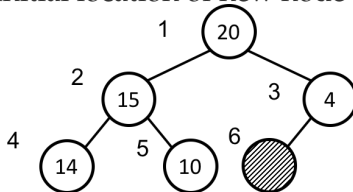
- linked representation add a parent field to each node
- array representation a heap is a complete binary tree simple addressing scheme

# Insertion into a max heap

Heap before Insertion

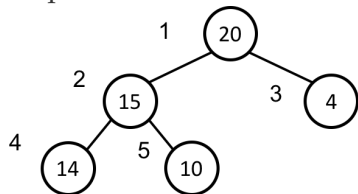


Initial location of new node

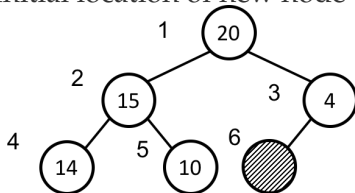


# Insertion into a max heap

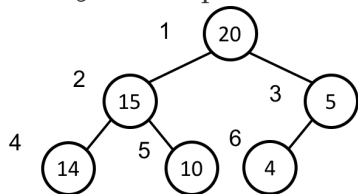
Heap before Insertion



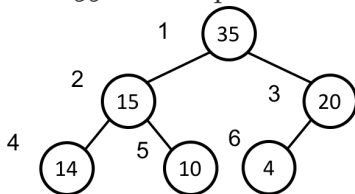
Initial location of new node



Insert 5 into heap



Insert 35 into heap





# Insertion into a max heap

- select the initial location for the node to be inserted → bottommost-rightmost leaf node
- insert a new key value adjust key value from leaf to root parent position:  $\lfloor i/2 \rfloor$
- time complexity :  $O(\text{depth of tree}) \rightarrow O(\log_2 n)$

# Insertion into a max heap

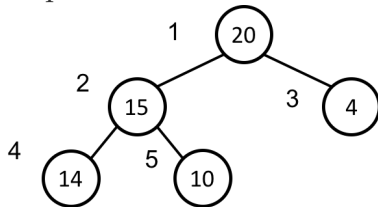
```
1 void insert_max_heap(element item, int *n) {
2     int i;
3     if (HEAP_FULL(*n)) {
4         fprintf(stderr, "The heap is full. \n");
5         exit(1);
6     }
7     i = ++(*n);
8     while ((i != 1) && (item.key > heap[i/2].key)) {
9         heap[i] = heap[i/2];
10        i /= 2;
11    }
12    heap[i] = item;
13 }
```

# Deletion from a max heap

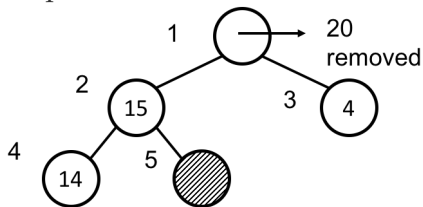
- always delete an element from the root of the heap
- restructure the tree so that it corresponds to a complete binary tree
- place the last node to the root and from the root compare the parent node with its children and exchanging out-of-order elements until the heap is reestablished

# Deletion from a max heap

Heap before deletion

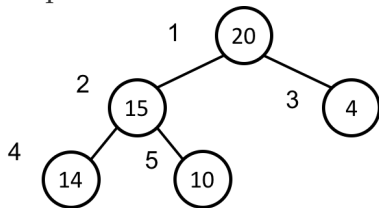


Heap Structure

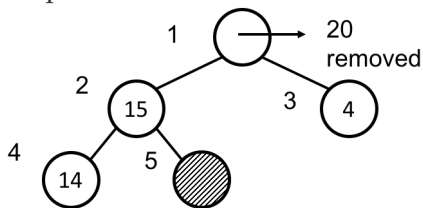


# Deletion from a max heap

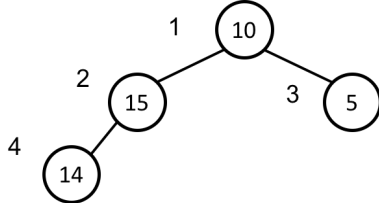
Heap before deletion



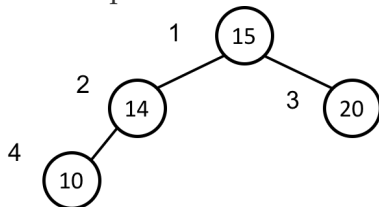
Heap Structure



10 inserted at the root



Final heap



# Deletion from a max heap

- select the removed node bottommost-rightmost leaf node
- place the node's element in the root node
- adjust key value from root to leaf compare the parent node with its children and exchange out-of-order elements until the heap is reestablished -
- time complexity :  $O(\text{depth of tree}) \rightarrow O(\log_2 n)$

# Deletion from a max heap

```
1  element delete_max_heap(int *n) {
2      element item, temp;
3      if (HEAP_EMPTY(*n)) {
4          fprintf(stderr, "The heap is empty\n");
5          exit(1);
6      }
7      item = heap[1];
8      temp = heap[(*n)--];
9      parent = 1;
10     child = 2;
11     while (child <= *n) {
12         /* compare left and right child's key values */
13         if ((child < *n) && (heap[child].key <
14                             heap[child+1].key))
15             child++;
16         if (temp.key >= heap[child].key) break;
17         /* move to the next lower level */
18         heap[parent] = heap[child];
19         parent = child;
20         child *= 2;
21     }
22     heap[parent] = temp; return item;
23 }
```

# BINARY SEARCH TREE





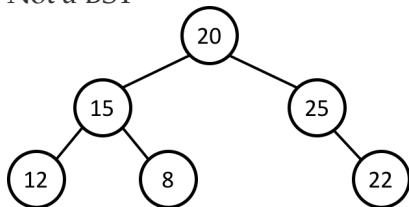
# Binary Search Tree (BST)

Binary search tree(BST) is a binary tree that is empty or each node satisfies the following properties:

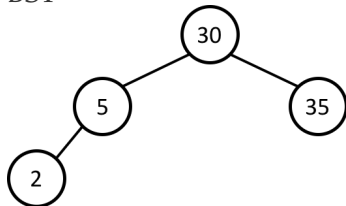
1. every element has a key, and no two elements have the same key
2. the keys in a nonempty left subtree must be smaller than the key in the root of the subtree
3. the keys in a nonempty right subtree must be larger than the key in the root of the subtree
4. the left and right subtrees are also BST

# Binary Search Tree

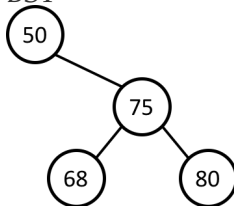
Not a BST



BST



BST



# Operations and their Complexity

Searching, Insertion, Deletion is bounded by  $O(h)$  where  $h$  is the height of the BST

can perform these operations both

- by key value and  
e.g., delete the element with key  $x$
- by rank  
e.g., delete the fifth smallest element

# Searching a BST

## Recursive search of a BST

```
1  tree_ptr search(tree_ptr root, int key) {  
2      /* return a pointer to the node that contains  
3       * key. If there is no such node, return NULL  
4       */  
5      if (!root) return NULL;  
6      if (key == root->data) return root;  
7      if (key < root->data)  
8          return search(root->left_child, key);  
9      return search(root->right_child, key);  
10 }
```

# Iterative Search of a BST

```
1  tree_ptr iter_search(tree_ptr tree, int key) {
2      while (tree) {
3          if (key == tree->data) return tree;
4          if (key < tree->data)
5              tree = tree->left_child;
6          else
7              tree = tree->right_child;
8      }
9      return NULL;
10 }
```

# Time complexity for searching

- Average case
  - $O(h)$  where  $h$  is the height of BST
- Worst case
  - $O(n)$  for skewed binary tree

# Inserting into a BST

```
1 void insert_node(tree_ptr *node, int num) {
2     tree_ptr ptr, temp = modified_search(*node, num);
3     if (temp || !(*node)) {
4         ptr = (tree_ptr)malloc(sizeof(node));
5         if (IS_FULL(ptr)) {
6             fprintf(stderr, "The memory is full\n");
7             exit(1);
8         }
9         ptr->data = num;
10        ptr->left_child = ptr->right_child = NULL;
11        if (*node)
12            if (num < temp->data)
13                temp->left_child = ptr;
14            else
15                temp->right_child = ptr;
16        else *node=ptr;
17    }
18 }
```

# Inserting into a BST

FIGURE-CODE?? **modified\_search** is slightly modified version of function **iter\_search**

- return NULL, if the tree is empty or num is present
- otherwise, return a pointer to the last node of the tree that was encountered during the search

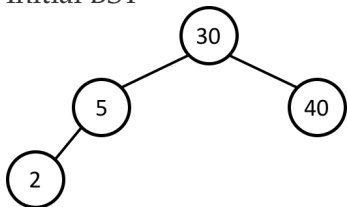
time complexity for inserting

- $O(h)$ , where  $h$  is the height of the tree

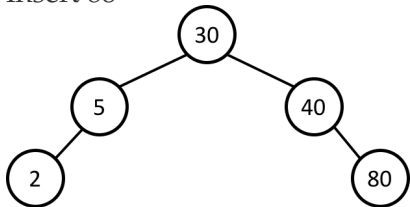


# Inserting into a BST

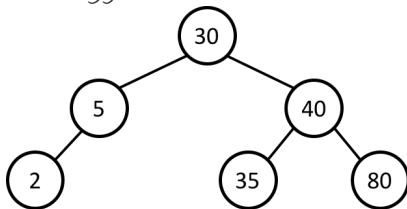
Initial BST



Insert 80



Insert 35



# Deleting from BST

deletion of a leaf node

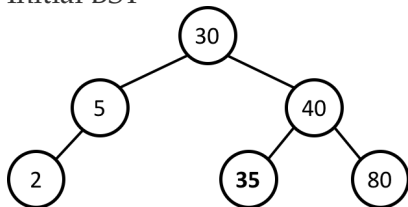
- deletion of a node with 1 child
- deletion of a node with 2 children

FIGURE- Deleting Algorithm is discussed in Chapter 10  
time complexity for deleting

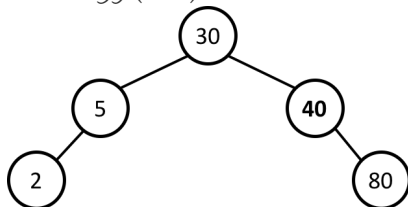
- $O(h)$  where  $h$  is the height of the tree

# Deleting a leaf or a node with a child

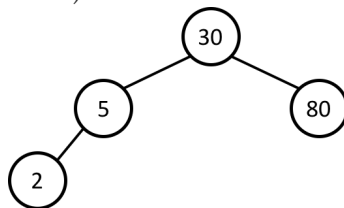
Initial BST



Delete 35 (leaf)

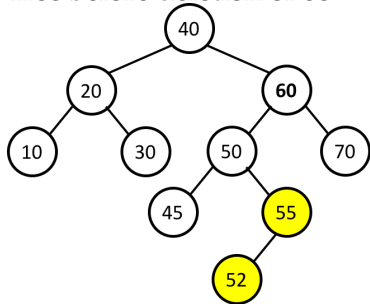


Delete 40 (node with single child)

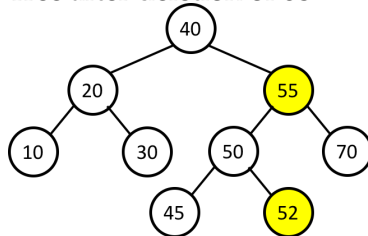


# Deletion of a node with two children

Tree before deletion of 60



Tree after deletion of 60



# Height of a BST

the height of a BST with  $n$  elements

- average case:  $O(\log_2 n)$
- worst case:  $O(n)$ 
  - e.g., use `insert_node` to insert the keys  $1, 2, 3, \dots, n$  into an initially empty BST

# Balanced (binary) Search Tree

- worst case height:  $O(\log_2 n)$
- searching, insertion, deletion is bounded by  $O(h)$  where  $h$  is the height of a binary tree
- *AVL tree, 2-3 tree, red-black tree are all introduced in Chapter 10*