## **CSE 12**: Basic data structures and object-oriented design

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# Main points from last lecture.

#### Exploiting relations over data

- Simple data structures such as lists store data without regard to order relations between elements.
- Lists offer O(I) add, but O(n) find and remove operations.
- In many applications, the user will want to find more often than add.
  - Even though a user may have "partial knowledge" (key) of an object, it may need the find (o) method to obtain the "whole record" (value).

#### Exploiting relations over data

- In Java, binary order relations can be defined between pairs of elements using the Comparable<T> interface, which includes the int compareTo (T o) method.
- Exploiting order relations enables us to achieve superior asymptotic time costs for find/removal operations.
- One prominent example of "accelerating search" is the binary search algorithm:
  - Assumes input array is already sorted.
  - Achieves log<sub>2</sub>(n) worst-case time cost by recursively dividing the list into two halves and searching only the relevant half.

#### Recursion

- Recursion is a tool for defining mathematical structures and constructing algorithms.
- Every recursive algorithm/definition contains:
  - A self-referential recursive part; and
  - A base case to prevent circularity.
- Recursive definitions can be specified in formal languages like Backus-Naur Form (BNF) to facilitate *automatic generation of code* (e.g., "compiler compilers").

#### Recursion

- Recursion is ubiquitous in computer science:
  - Binary search executes recursively.
  - The input array to binary search is typically sorted using (recursive) MergeSort or QuickSort.
  - Data structures such as trees, and even linked lists, can be formulated recursively.
    - E.g., "a linked list is either a node, or a node followed by a linked list."
  - Source code itself is a recursive structure.
  - Compilers "lex" and "parse" the individual symbols/tokens of source code using algorithms generated automatically from recursive definitions of source code structure.

## Binary search

- Binary search is a recursive algorithm for finding a target value in a sorted array of data in log<sub>2</sub>(n) (worst-case) time.
- Binary search requires a binary order relation to be defined on all the elements.
- For primitive numeric types like int, double, etc., we can use > or >= to compare data.
- For objects, we can use the int compareTo(T o) method of the Comparable<T> interface.

#### Recursive data structures

- Despite the log<sub>2</sub>(n) efficiency of binary search, its utility on *lists* is limited:
  - Binary search would be very efficient on a linked list because of the lack of ability to "jump" to an arbitrary node.
  - Binary search on array-based lists is efficient; however, the array must be maintained in sorted order.
    - If the user adds a new element, the "correct spot" must be located and all subsequent elements "shifted over".

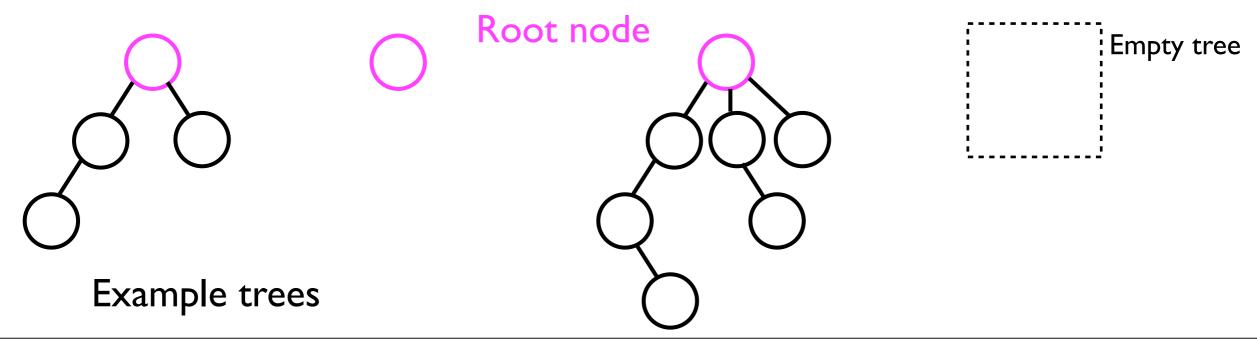
#### Recursive data structures

- It would be desirable to create data structure that offer efficient implementations of both add(o) and find(o)/remove(o).
- Over the next few lectures we will cover two such structures -- heaps and binary search trees.
- Both these ADTs are based on binary trees, which are non-linear recursive data structures.

## Binary Trees

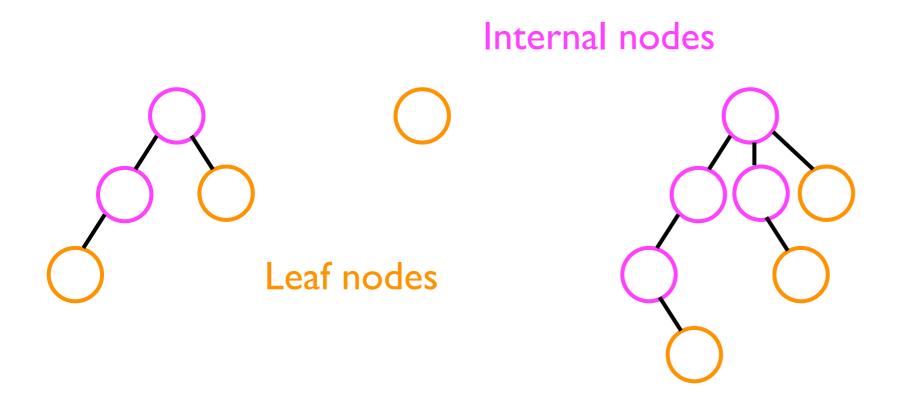
#### Trees

- A tree is an interconnected set of *nodes* that are organized in a hierarchy.
  - There is one node labeled the *root* of the tree.
  - Every node except the root has exactly I parent node.
  - Each node may have 0 or more *child* nodes ("children").
    - Cycles are prohibited -- only one path may exist between any pair of nodes.
  - Parents and children are connected by edges.



#### Trees

- A node with no children is called a *leaf*.
- A node with at least one child is called an *internal node*.



## Depth, height, and level

• Depth (iterative definition):

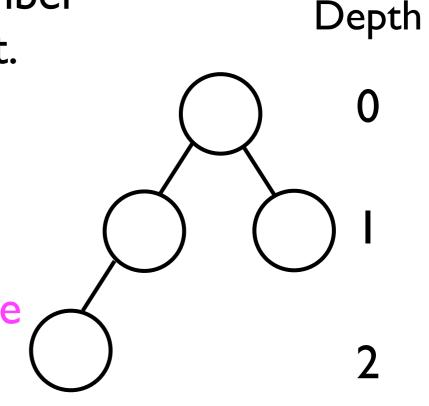
- The depth of a node N is the number of edges between N and the root.
- The root has depth 0.
- Depth (recursive definition):

Base case

The depth of a node n is 0 for the root; or

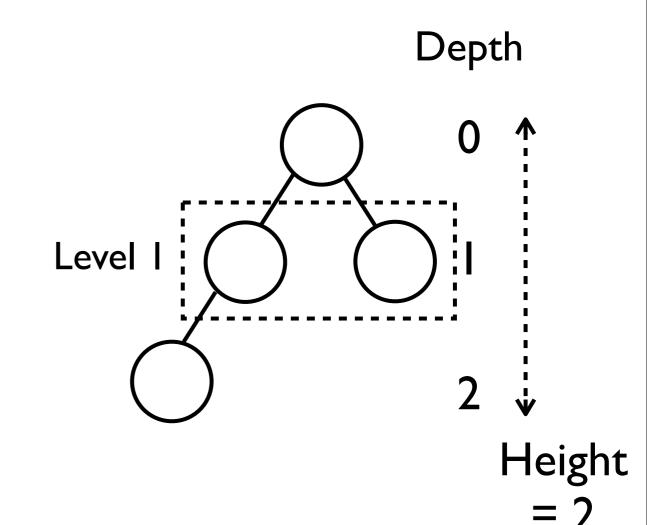
Recursive part

I + the depth of*n*parent node.



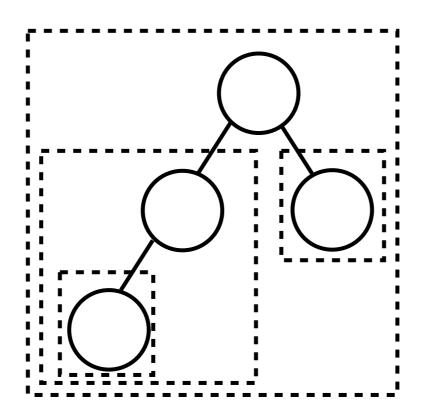
## Depth, height, and level

- The *height* of a tree *T* is the maximum depth of any node in the tree.
  - Equivalent to length of longest path from the root to any leaf.
- A level of the tree consists of all the nodes at a particular depth.



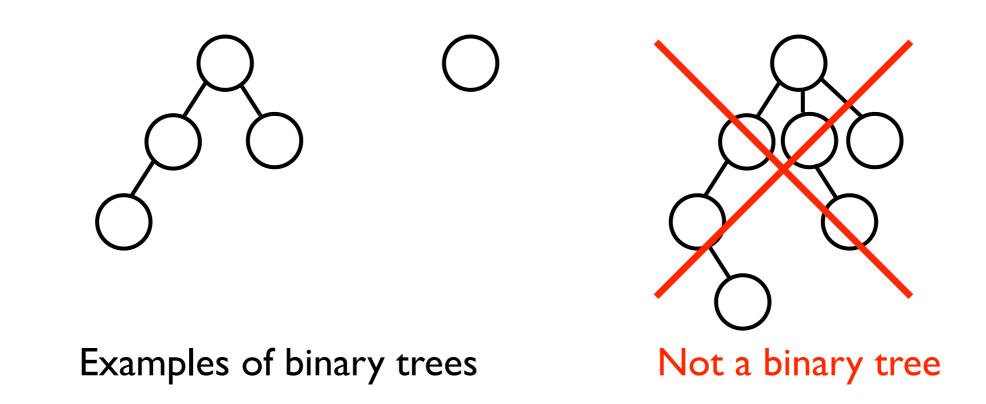
#### Sub-trees

- Each node in a tree is the root of its own sub-tree.
- The gray boxes below show all possible subtrees.



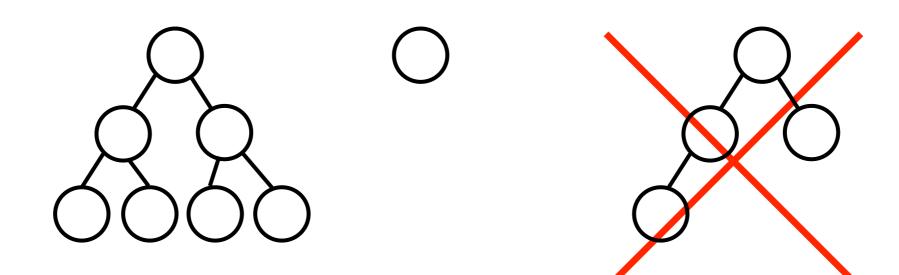
## Binary trees

• A binary tree is a tree in which every node has at most 2 children.



## Binary tree properties

 A binary tree of height h is full if every node at depth d < h has 2 children.</li>



Examples of full binary trees

Not a full binary tree

## Binary tree properties

- A full binary tree with height h has 2<sup>h</sup> leaf nodes and 2<sup>h+1</sup> I nodes in total.
- Conversely, a full binary tree with n nodes total has height log<sub>2</sub>(n+1)-1.

## Binary tree properties

- More generally, a binary tree T (not necessarily full) with n nodes has:
  - Minimum height  $\log_2(n+1) 1$  (when T is full).
  - Maximum height n-I (when T is just a "chain" of nodes in which no node has more than I child).
- Why important?
  - The time cost of important tree operations such as find(o) depend on the average/maximum height of an arbitrary node in the tree.

#### Tree nodes

- Like nodes in a linked list, nodes in a tree contain a *data element* (otherwise, trees would be useless for ADTs).
- However, nodes in a tree contain more than 2 "links" (edges) to other nodes.
  - One link to parent node.
  - One link to each child node.

#### Node class for general trees

• From this description, we can create a Node class for use in general trees:

```
class Node<T> {
   Node<T> _parent; // link to parent node
   Node<T>[] _children; // links to children
   int _numChildren;
   T _data; // data element the node stores
}
```

 Alternatively, we can used a linked list to manage the child Nodes:

```
class Node<T> {
   Node<T> _parent; // link to parent node
   LinkedList<T> _children; // links to children
   T _data; // data element the node stores
}
```

• From binary trees, we can define a Node more simply:

```
class Node<T> {
    Node<T> _parent;
    Node<T> _leftChild, _rightChild;
    T _data; Defined to be null if child does not exist.
}
```

```
final Node<String> root = new Node<String>();
root._leftChild = new Node<String>();
root._rightChild = new Node<String>();
root._rightChild._leftChild = new Node<String>();
```

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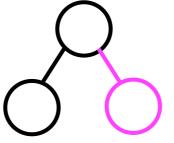
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}
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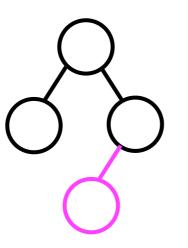
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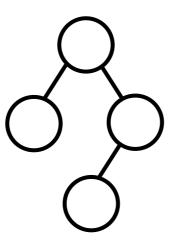
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final Node<String> root = new Node<String>();
root._leftChild = new Node<String>();
root._rightChild = new Node<String>();
root. rightChild. leftChild = new Node<String>();
```



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   Node<T> _leftChild, _rightChild;
   T _data;
}
```

```
final Node<String> root = new Node<String>();
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root._rightChild = new Node<String>();
root._rightChild._leftChild = new Node<String>();
```



### Tree operations

- We will consider three fundamental operations:
  - add (o, parent, leftOrRight) -- add a new node (containing the object o) as the leftOrRight child of the specified parent.
  - find (o) -- find and return the node containing data o.
  - remove (o) -- remove the node containing the specified data.
- Note that these operations will be used internally by ADTs we develop based on trees.
  - This is why we find and return the *node* instead of the data contained *inside* the node.
  - They will not be exposed to the user of, say, the Heap ADT, which is built using a binary tree.

## Adding a node

 Given the parent node, it is straightforward to add a new node that is either the left or right child of the parent:

```
void add (T o, Node<T> parent,
        ChildType leftOrRight) {
   final Node<T> node = new Node<T>();
   node._data = o;
   if (leftOrRight == ChildType.LEFT_CHILD) {
      parent._leftChild = node;
   } else {
      parent._rightChild = node;
   }
}
```

## Adding a node

 Given the parent node, it is straightforward to add a new node that is either the left or right child of the parent:

```
A Java enumeration type.
```

```
void add (T o, Node<T> parent,
        ChildType leftOrRight) {
   final Node<T> node = new Node<T>();
   node._data = o;
   if (leftOrRight == ChildType.LEFT_CHILD) {
     parent._leftChild = node;
   } else {
     parent._rightChild = node;
   }
}
```

## Java enumerations

- Enumerations are types that contain only a few possible values.
- Each value in the enumeration can be given a meaningful name,.
- If we define an enumeration type called ChildType: enum ChildType {
   LEFT\_CHILD, RIGHT\_CHILD
   }
- ...then we can declare and use a variable of that type: ChildType leftOrRight = ChildType.RIGHT\_CHILD;

## Java enumerations

 Instead of defining an enumeration type, one could instead just use an integer and "assign" meaning to these values, e.g.:

```
int leftOrRight;
leftOrRight = 1; // 1 indicates left child
leftOrRight = 2; // 2 indicates right child
...
if (leftOrRight == 2) {
   // Do something with the right child
}
```

- But what if leftOrRight was somehow set to an invalid value?
  - With enumerations, the Java compiler prevents this possibility from ever happening.
     ChildType leftOrRight = 3; // Won't compile

 Finding a node in a binary tree is best implemented using recursion. We'll let node represent the root of the sub-tree we are currently searching.

```
Node<T> find (Node<T> root, T o) {
                                          Combined assignment to
  if (root. data.equals(o)) {
                                          node and comparison to null.
    return root;
                                          This is compact notation, but
                                          it sometimes can also yield
  Node<T> node;
                                          more readable code.
  if ( leftChild != null &&
       (node = find( leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
       (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root: a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
                                  No
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                  f
      (node = find( leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root: a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                  f`
      (node = find(_leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root:b
                                                    a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
                                  No
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                 f
      (node = find( leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root:b
                                                   a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
    return root;
  Node<T> node;
                               No
  if ( leftChild != null &&
                                                 f
      (node = find( leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root:b
                                                    a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                 f
      (node = find( leftChild, o)) != null) {
    return node;
  } else if (_rightChild != null && No
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root:b
                                                    a
Node<T> find (Node<T> root, T o) {
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    return root;
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                                                  〔f〕
      (node = find( leftChild, o)) != null) {
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    return node;
  } else {
    return null;
```

```
root: c
                                                    a
Node<T> find (Node<T> root, T o) {
  if (root._data.equals(o)) { No
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                 (f
      (node = find( leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
      (node = find( rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

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root: c
                                                    a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
    return root;
  Node<T> node;
  if ( leftChild != null &&
                                                  f`
      (node = find(_leftChild, o)) != null) {
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root:e
                                                    a
Node<T> find (Node<T> root, T o) {
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      (node = find(_rightChild, o)) != null) {
    return node;
  } else {
    return null;
```

```
root:e
                                                       a
Node<T> find (Node<T> root, T o) {
  if (root. data.equals(o)) {
    return root; The returned node will "propagate
                      back up" the recursive calls.
  Node<T> node;
  if ( leftChild != null &&
                                                    f
       (node = find(_leftChild, o)) != null) {
    return node;
  } else if ( rightChild != null &&
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Node<T> find (Node<T> root, T o) {
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```
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      (node = find( rightChild, o)) != null) {
    return node;
  } else {
                      return null;
```

- How to implement the remove (o) operation depends on whether the node containing o is a *leaf* node or an *internal* node.
  - We can use the find method to locate the correct node.
- If the node is a leaf, then we just "snip" it off from its parent, e.g.:
   node.\_parent.\_rightChild = null;

node

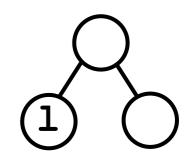
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  - We can use the find method to locate the correct node.
- If the node is a leaf, then we just "snip" it off from its parent, e.g.:
   node. parent. rightChild = null;

- If, however, the node is an internal node, then "snipping" it off would remove the whole sub-tree.
- To just remove the node but not its children, we need to *replace* the internal node with some other node.
- Instead of actually removing and replacing n, we can instead just replace the *data* it stores with the data of another *leaf* node (e.g., 1).

n

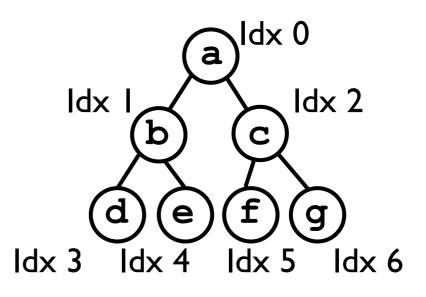
• We can then remove the "old" 1.

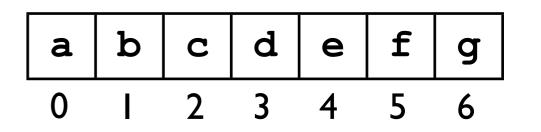
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- To just remove the node but not its children, we need to *replace* the internal node with some other node.
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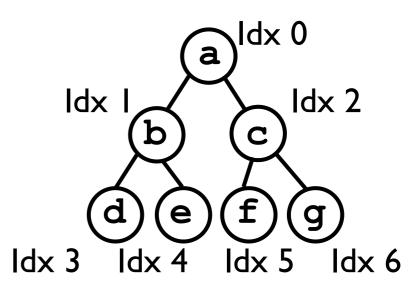
• We can then remove the "old" 1.

- Just as lists can be implemented by either a linked chain of Nodes or an array, a binary tree can be implemented as a tree of Nodes or an array as well.
- Each "node" in the tree will be assigned a unique index at which its *data* should be stored.
- Given the index of a particular "node", the index of its parent, and the indices of its children, can be easily computed.

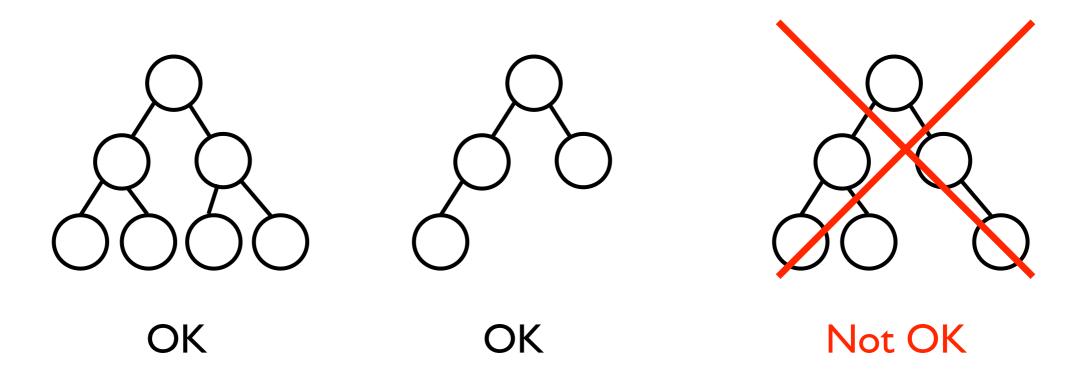




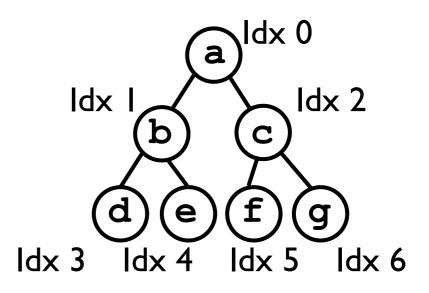
- The index(n) of a node n with parent p is:
  - 0 if *n* is the root node.
  - $2^*$ index(p)+1 if *n* is left child of *p*.
  - 2\*index(p)+2 if n is right child.
- The parentIndex(idx) of a node stored at idx is (idx-1)/2.
- Examples: index(c) = 2\*index(a)+2 = 2\*0+2 = 1
   parentIndex(4) = (4-1)/2 = 1.5 = 1.

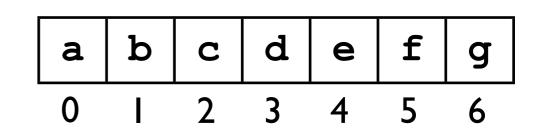


- Note that this array-based representation applies only to complete binary trees.
  - A binary tree is *complete* if every level of the tree is completely filled except possibly the last *and* the last level is (partially) filled from left to right.



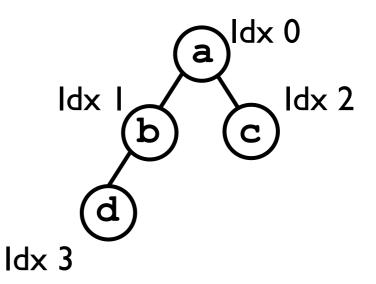
- Even though the data are being stored in a regular Java array, their locations in the array still encode a tree structure among them.
  - This means that binary tree-based algorithms we develop can still offer time-cost advantages over linear lists.

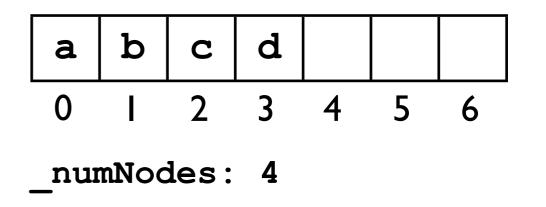




## Adding a node

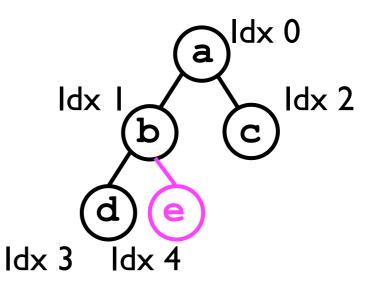
- Given that the binary tree must be complete, it is only valid to add a node n to be the next child on the last level of the tree.
- The index into the array of where this "next child" should be stored is always just \_numNodes, where \_numNodes is the current number of nodes in the tree.

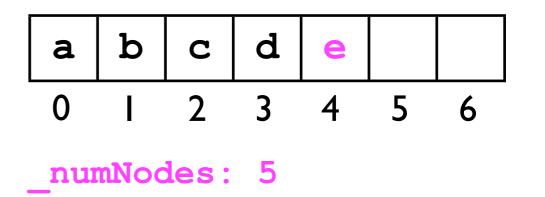




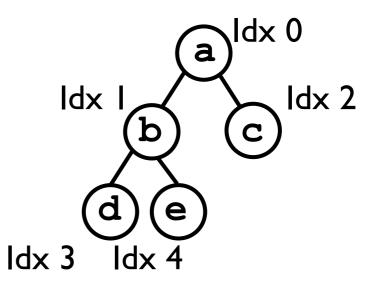
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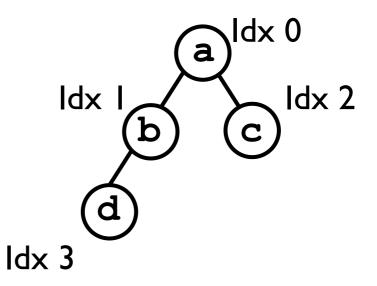


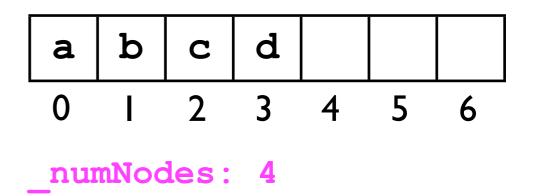
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- All we must do is decrement \_numNodes to indicate that the "slot" in the array of the removed node is no longer valid.





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- All we must do is decrement \_numNodes to indicate that the "slot" in the array of the removed node is no longer valid.





 To find the index of a node n whose data element equals o:

```
int find (int rootIdx, T o) {
  if ( nodeArray[rootIdx].equals(0)) {
    return rootIdx;
  }
                       Make sure each child exists before recursing!
  int idx;
  if (leftChild(rootIdx) < numNodes &&
       (idx = find(leftChild(rootIdx), o)) >= 0) {
    return idx;
  } else if (rightChild(rootIdx) < numNodes &&</pre>
       (idx = find(rightChild(rootIdx), o)) >= 0) {
    return idx;
  } else {
                       Helper methods to determine
    return -1;
                     index of left and right child nodes.
  }
```

## Binary trees to accelerate search.

# Binary trees to accelerate search

- We have now constructed considerable "infrastructure" for building binary trees, using either "linked nodes" or a Java array for the tree's underlying storage.
- Trees are useful in their own right for representing *hierarchical structures*, e.g., genealogical data.
- However, for the moment we are interested in how they can store and accelerate search of data on which an ordering relation is defined.

# Binary trees to accelerate search

- Heaps and binary search trees are two ADTs based on binary trees that accelerate search.
- A heap offers fast access to the largest element in a collection of related objects.
  - O(I) worst-case time cost for findLargest.
  - O(log n) worst-case time cost for removeLargest.
  - O(log n) worst-case time cost for add.
  - O(n) worst-case time-cost for find and remove.

## Binary trees to accelerate search

- A binary search tree (BST) offers:
  - O(log n) average-case time cost for add, find, remove, and findLargest.
  - O(n) worst-case time cost for add, find, remove, and findLargest.
- AVL trees and red-black trees are more complicated, but they offer:
  - O(log n) worst-case time cost for add, find, remove, and findLargest.

## Why findLargest?

- Why would we want to find the largest data element stored in a container?
- The findLargest method is required by priority queues.
  - A priority queue is a queue in which elements are dequeued not in FIFO order, but instead in order of highest-to-lowest priority.
  - A priority queue is typically implemented using a *heap*.



Taken from Paul Kube's slides.

#### Heaps.

## Heaps

- A max-heap is an ADT for storing data so that the largest element (according to some binary order relation) can always be found and removed quickly.
- A min-heap is defined analogously for the smallest element.
- Internally, a heap is a complete binary tree which satisfies the heap condition:
  - The root of every sub-tree is no smaller than any node in the sub-tree. (For max-heap).
  - The root of every sub-tree is no larger than any node in the sub-tree. (For min-heap).
- This ensures that, to implement findLargest/findSmallest, we can always just return the root node of the tree.

## Heaps

• A max-heap has the following interface:

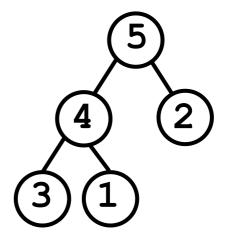
```
// All operations must preserve the heap condition.
interface MaxHeap {
 // Adds o to the heap.
 void add (T o);
 // Removes the node whose data element equals o.
 void remove (T o);
 // Removes and returns the largest node in the heap.
 T removeLargest ();
 // Returns the largest node in the heap.
 T findLargest ();
  // Finds and returns the node whose data element
  // equals o.
 T find (T o);
 // Returns the number of data stored in the heap.
  int size ();
}
```

#### Implementing heaps

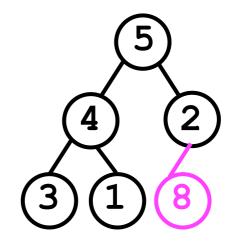
- Since heaps are anyway a *complete* binary tree, it is convenient and efficient to implement them using an array.
  - However, they could also be implemented using linked nodes.
- The challenge when implementing a heap is to preserve the heap property upon every *mutation* to the heap (add/remove).

- In order to add a new element o to a max-heap while preserving the heap condition, we execute the following procedure:
  - Add a new node *n* containing o to the last level of the tree (ensure *completeness* of the tree).
    - This may violate the tree's heap condition because o may be larger than one of its parents.
  - We then "fix" the heap by "swapping" node n with its parent p.
    - We repeat this process -- known as bubbling up -- as many times as necessary until the tree is a heap again.

• Consider the heap to the right. (Notice that it satisfies the heap condition).

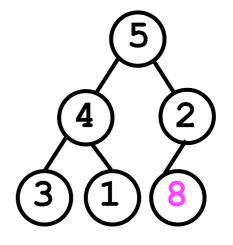


- Consider the heap to the right. (Notice that it satisfies the heap condition).
- Suppose we add value 8 to the bottom-level of the heap.
  - The tree no longer satisfies the heap condition.

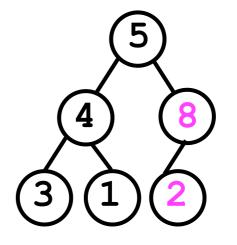


2 is smaller than one of the nodes in its sub-tree!

- Consider the heap to the right. (Notice that it satisfies the heap condition).
- Suppose we add value 8 to the bottom-level of the heap.
  - The tree no longer satisfies the heap condition.
  - We have to "bubble up" the 8 we just added to restore the heap condition.

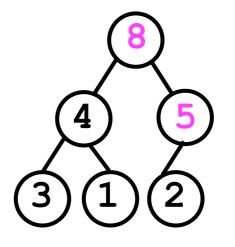


- Consider the heap to the right. (Notice that it satisfies the heap condition).
- Suppose we add value 8 to the bottom-level of the heap.
  - The tree no longer satisfies the heap condition.
  - We have to "bubble up" the 8 we just added to restore the heap condition.



Not done yet -- 5 is still smaller than 8.

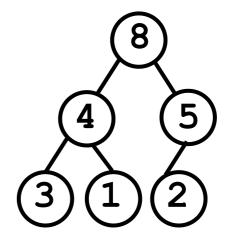
- Consider the heap to the right. (Notice that it satisfies the heap condition).
- Suppose we add value 8 to the bottom-level of the heap.
  - The tree no longer satisfies the heap condition.
  - We have to "bubble up" the 8 we just added to restore the heap condition.



Now it is a heap again!

- Consider the heap to the right. (Notice that it satisfies the heap condition).
- Suppose we add value 8 to the bottom-level of the heap.
  - The tree no longer satisfies the heap condition.
  - We have to "bubble up" the 8 we just added to restore the heap condition.





```
    We can implement the add(o) method as:
void add (T o) {
    _nodeArray[_numNodes] = o;
    _numNodes++;
    bubbleUp(_numNodes - 1);
}
```

 We must then also implement bubbleUp(idx): void bubbleUp (int idx) {
 If node at idx is "larger" than its parent: Swap data in the node and its parent; Recursively bubbleUp(parentIdx(idx));
 }
}

 Alternatively, we can write an *iterative* version of bubbleUp(idx):

```
void bubbleUp (int idx) {
   While node at idx is "larger" than its parent:
    Swap data in the node and its parent;
   Set idx to be parentIdx(idx);
}
```

#### Next lecture

- Finding and removing elements.
- "Trickling down" a node.