Binary Trees, Binary Search Trees, and Heaps

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CSC220 Programming II - Spring 2020







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Linked representation





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 - first variable points to entry with first element.



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- Linked representation
 - **first** variable points to entry with first element.
 - last variable points to entry with last element.
 - Successor of entry is entry.next.





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 - theElements is array of elements.
 - size is number of elements.
 - First element is theElements[0].





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 - **theElements**[j] does not have a predecessor if j = 0.





Review: list order



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Possible list orders:





- ► Possible list orders:
 - unsorted,

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 - unsorted,
 - eggs





- ► Possible list orders:
 - unsorted,
 - eggsmilk





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 - apples
 - pasta
 - cheese
 - 011000
 - sorted.





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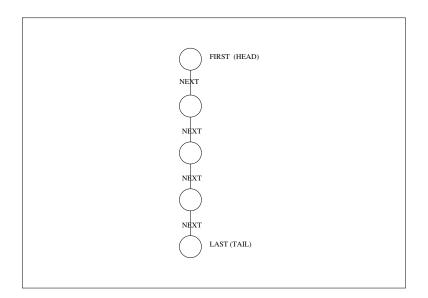


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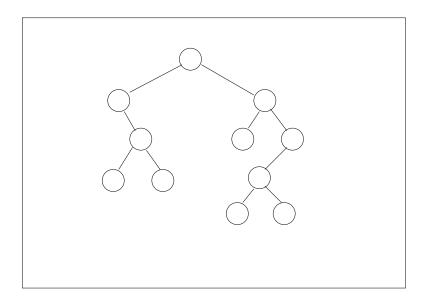
List







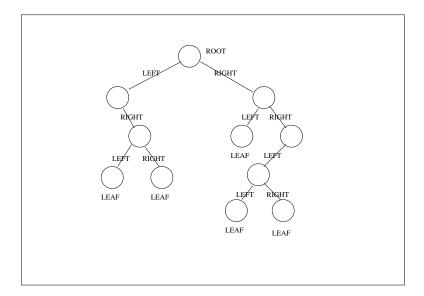
Binary Tree







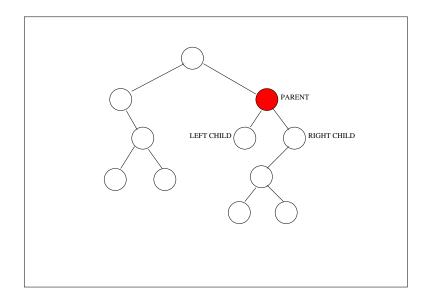
Roots and Leaves







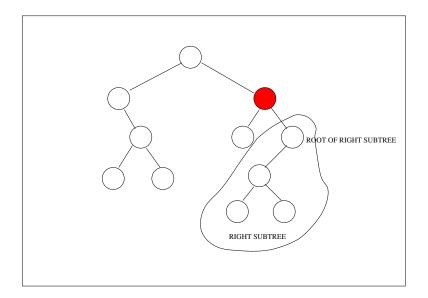
Parent, Left Child, Right Child







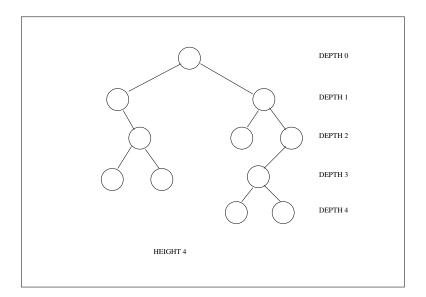
Subtree







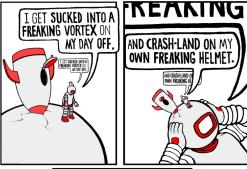
Depth of Element and Height of Tree







Trees can be defined RECURSIVELY





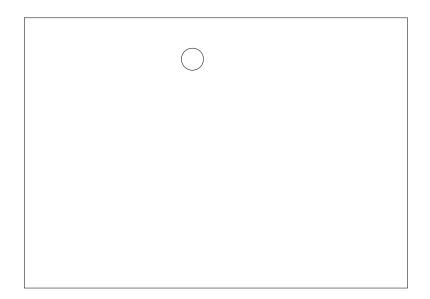




Recursive Definition: Empty



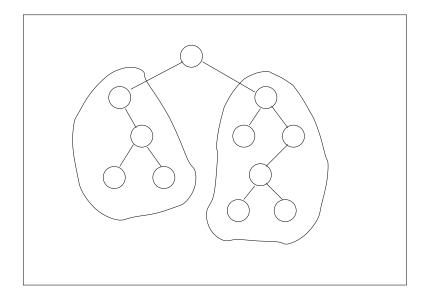
or a single element







with a left and right (sub)tree

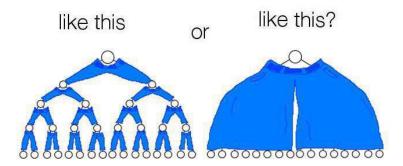






Question

If a binary tree wore pants would he wear them









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- Array representation wastes a lot of space unless tree is complete.
 - All levels except the bottom level are full.
 - Bottom level is filled from left.





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 - Right child of theElements[i] is at theElements[2i + 2], but only if 2i + 2 < size. Otherwise, there is no right child.</p>
 - ► For 0 < j < size, parent of **theElements**[j] is at **theElements**[(j-1)/2].
- Array representation wastes a lot of space unless tree is complete.
 - All levels except the bottom level are full.
 - Bottom level is filled from left.
 - ▶ Corresponds to using all the elements in 0 to size—1.







► Search order.





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- For example, at a hospital emergency room serve in order of minutes until death.







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- ► For java.util.TreeMap, get, put, and remove are all O(log n).





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 - Offer and poll are O(log n).



