

Binary Trees, Binary Search Trees, and Heaps

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CSC220 Programming II – Spring 2019



Review: What is a list?

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 - ▶ The subtree of its left child is called its *left subtree*.



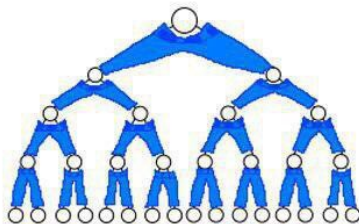
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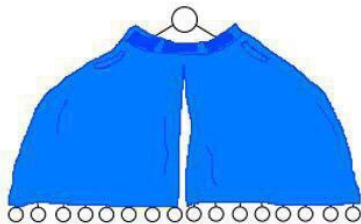
If a binary tree wore pants would he wear them

like this



or

like this?



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- ▶ Good for *priority queue*.
- ▶ Serve items in order of key.
- ▶ For example, at a hospital emergency room serve in order of minutes until death.



More notes



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This is our gold coin example again.



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Worst case for search trees



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- ▶ Yes, using a *balanced* tree.



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- ▶ Yes, using a *balanced* tree.
- ▶ We will learn about tree balancing in prog08.



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 - ▶ 16-31 entries means 5 levels.



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- ▶ Cost of **offer**



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- ▶ Cost of **offer**
 - ▶ Start at bottom.



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