

REFRESHER ON DATA STRUCTURES



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AGENDA

Heaps

Hash Tables

Binary Search Tree

For every data structure:

Basics

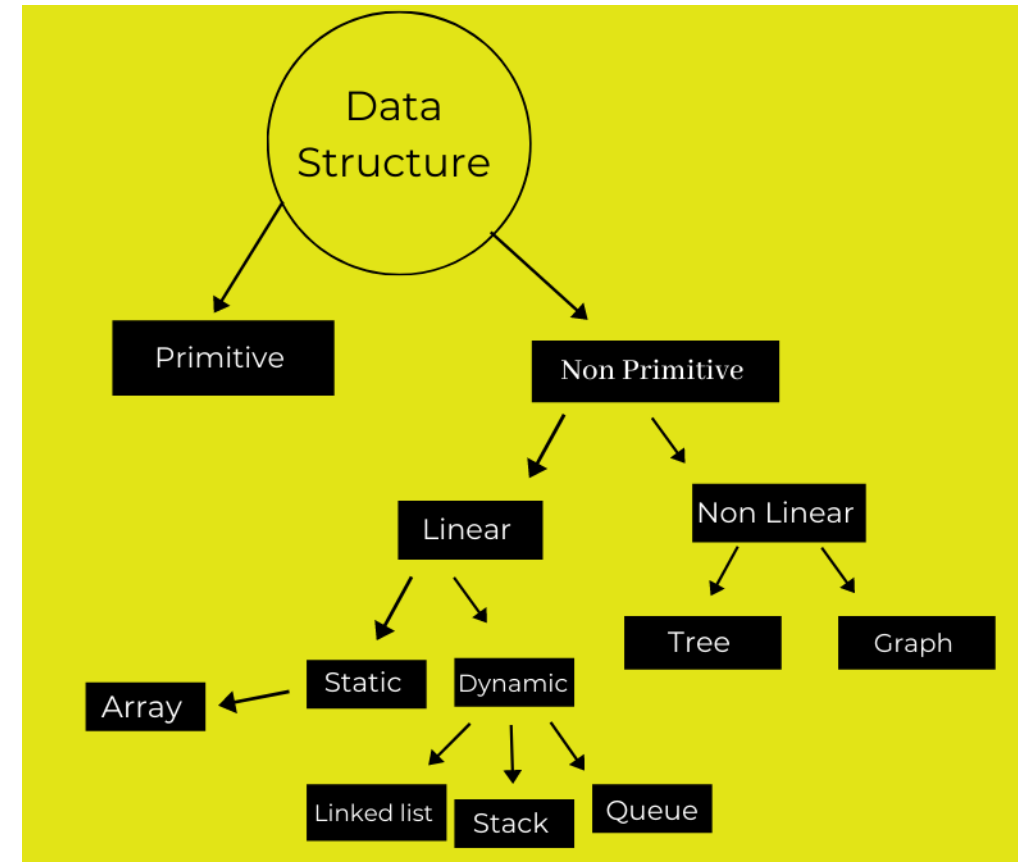
Application

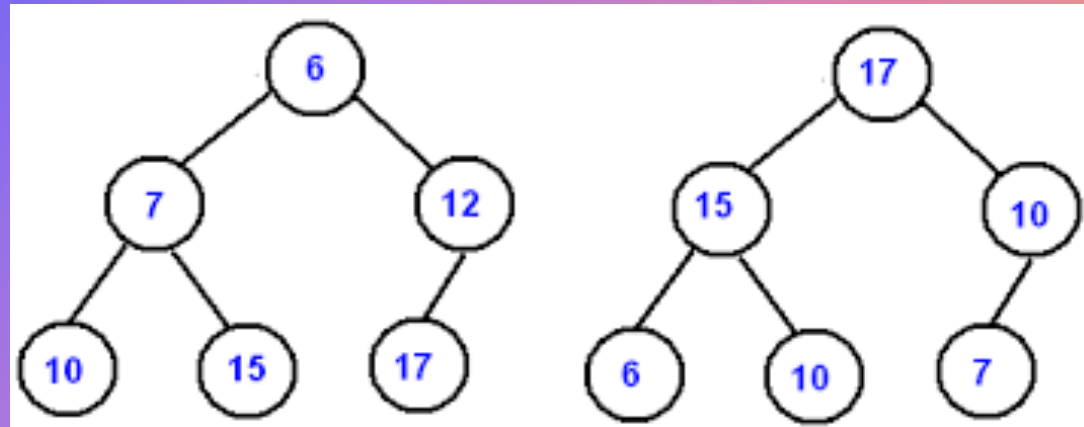
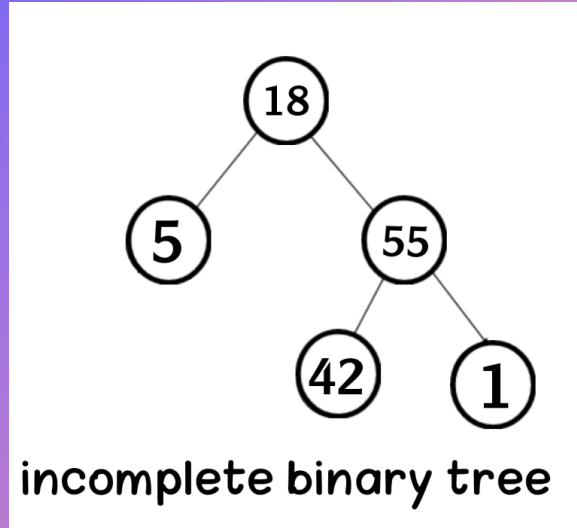
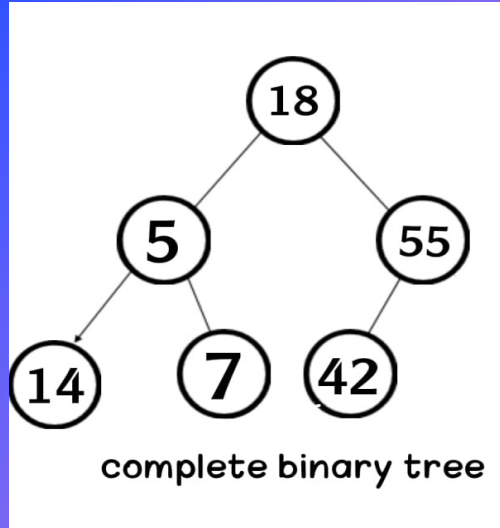
Operations

Code Walkthrough

What are data structures and why do we need them?

- Format that stores data values and the relationship between them.
- Used for organizing data in memory.
- Provides efficiency, reusability and abstraction.





Identify which is which?

Heaps

A **heap** is a specialized tree-based data structure which is essentially a complete tree that satisfies the **heap property**:

Min heap: Parent \leq Children

Max heap: Parent \geq Children

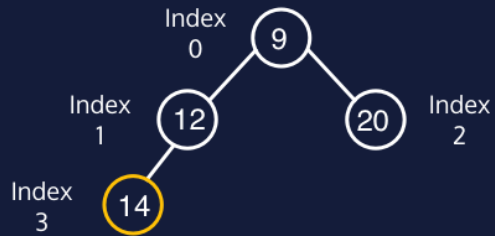
Min - Heap



Binary Tree



Array



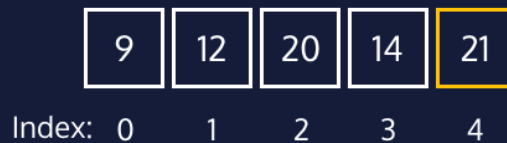
Binary Tree



Array



Binary Tree



Array

Applications of Heaps

1. Priority Queue
2. Heap Sort
3. Getting The minimum value or the maximum value in a constant time

Operations with Heaps

Heapify

Process to rearrange the elements of the heap in order to maintain the heap property. It is done when a certain node causes an imbalance in the heap due to some operation on that node.

Complexity: ?

Find Max/Min

Simply returns the max/min element found at the root node of the heap.

Complexity: ?

Extract Min/Max

Returns and deletes the maximum or minimum element in max-heap and min-heap respectively.

Complexity: ?

Operations with Heaps

Insertion

The insertion in the heap follows the following steps:

- Insert the new element at the end of the heap
- Since the newly inserted element can distort the properties of the heap, perform heapify

Complexity: ?

Deletion

The deletion operations follow the following step:

- Replace the element to be deleted by the last element in the heap.
- Delete the last item from the heap.
- Now, the last element is placed at some position in heap, it may not follow the property of the heap, so we need to perform heapify to correct that

Complexity: ?

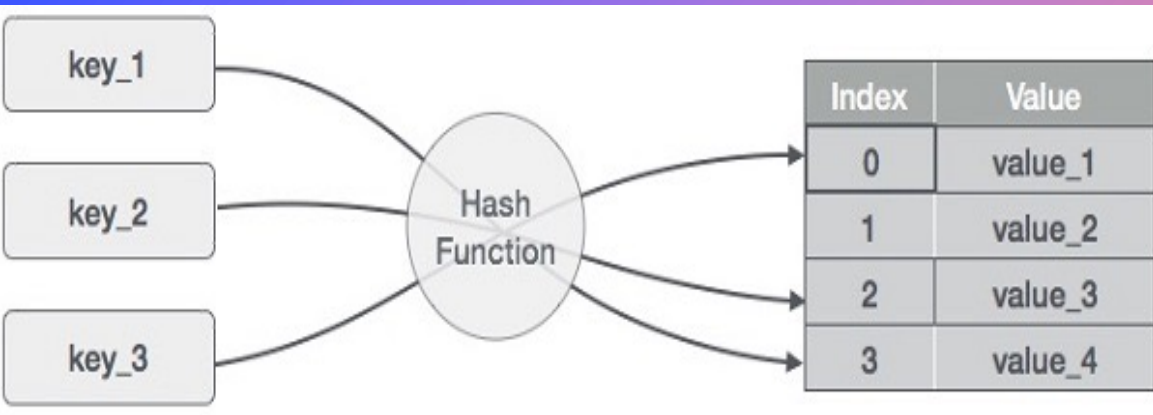
Complexities

OPERATION	TIME COMPLEXITY		SPACE COMPLEXITY
Insertion	Best Case:	$O(1)$	$O(1)$
	Worst Case:	$O(\log N)$	
	Average Case:	$O(\log N)$	
Deletion	Best Case:	$O(1)$	$O(1)$
	Worst Case:	$O(\log N)$	
	Average Case:	$O(\log N)$	
Searching	Best Case:	$O(1)$	$O(1)$
	Worst Case:	$O(N)$	
	Average Case:	$O(N)$	
Max Value	In MaxHeap:	$O(1)$	$O(1)$
	In MinHeap:	$O(N)$	
Min Value	In MinHeap:	$O(1)$	$O(1)$
	In MaxHeap:	$O(N)$	
Sorting	All Cases:	$O(N \log N)$	$O(1)$
Creating a Heap	By Inserting all elements:	$O(N \log N)$	$O(N)$
	Using Heapify	$O(N)$	$O(1)$

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IMPLEMENTATION

<https://colab.research.google.com/drive/1nlxGhyvakdG4ZvEJP3ZvUMufQHQIgn4b?usp=sharing>



Sr.No.	Key	Hash	Array Index
1	1	$1 \% 20 = 1$	1
2	2	$2 \% 20 = 2$	2
3	42	$42 \% 20 = 2$	2
4	4	$4 \% 20 = 4$	4
5	12	$12 \% 20 = 12$	12
6	14	$14 \% 20 = 14$	14
7	17	$17 \% 20 = 17$	17
8	13	$13 \% 20 = 13$	13
9	37	$37 \% 20 = 17$	17

Hash Table

- Stores data in an associative manner
- Storage medium: Array; Each data value has its own unique index value. Hash technique is used to generate this index value
- **Major +:** If we know the index of the desired data, search/insert become very fast irrespective of the size of the data.
- **In Python:** Dictionary data type represents implementation of hash tables.

Collision Resolution

Linear Probing

key	0	1	2	3	4	5	6	7	8	9
value		1231	5982				4536	4637		8359
			↑							
			2392							

key	0	1	2	3	4	5	6	7	8	9
value		1231	5982				4536	4637		8359
				↑						
				2392						

Chaining

key	0	1	2	3	4	5	6	7	8	9
value		1231	5982				4536	4637		8359
			↓							
			2392							

key	0	1	2	3	4	5	6	7	8	9
value		1231	5982				4536	4637		8359
			↓				↓			
			2392				8986			
			↓							
			8762							

Applications of Hash Tables

- Password verification
- Plagiarism / Pattern Matching
- Compilers

Operations with Hash Tables

Searching

The insertion in the hash table follows the following steps:

- Compute the hash code of the key passed and locate the element using that hash code as index in the array.
- Use linear probing to get the element ahead if the element is not found at the computed hash code.

Complexity: ?

Insertion/Deletion

The deletion operations follow the following step:

- Compute the hash code of the key passed and locate the element using that hash code as index in the array.
- (Insertion) Use linear probing for empty location, if an element is found at the computed hash code.
- (Deletion) Use linear probing to get the element ahead if an element is not found at the computed hash code. When found, store a dummy item there to keep the performance of the hash table intact.

Complexity: ?

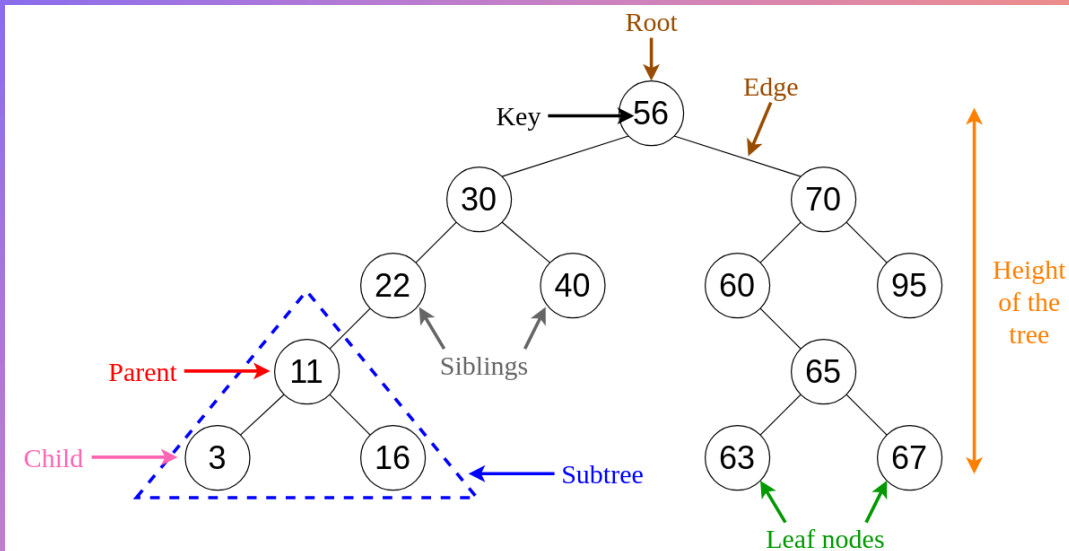
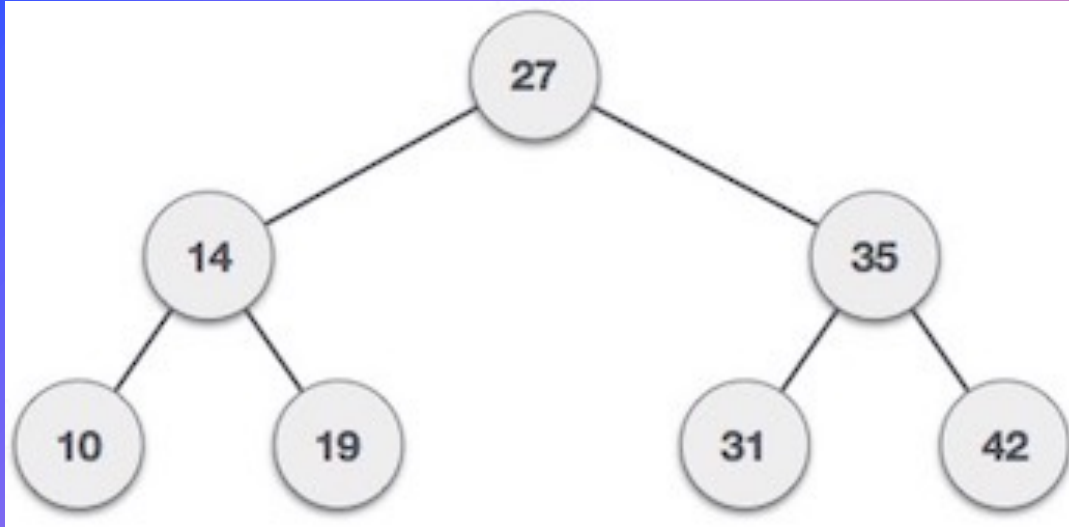
Complexities

ACTIVITY	BEST CASE COMPLEXITY	AVERAGE CASE COMPLEXITY	WORST CASE COMPLEXITY
Searching	$O(1)$	$O(1)$	$O(n)$
Insertion	$O(1)$	$O(1)$	$O(n)$
Deletion	$O(1)$	$O(1)$	$O(n)$
Space Complexity	$O(n)$	$O(n)$	$O(n)$

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IMPLEMENTATION

https://drive.google.com/file/d/17ENICJW81scufGd6sSb0nVhN6X2_tZNC/view?usp=sharing



Binary Search Tree

Tree:

- Each tree has a root node at the top (also known as Parent Node) containing some value (can be any datatype).
- The root node has zero or more child nodes.
- Each child node has zero or more child nodes, and so on. This creates a subtree in the tree. Every node has its own subtree made up of its children and their children, etc. This means that every node on its own can be a tree.

Additionally, in a BST:

- Each node has a maximum of up to two children.
- $\text{left_subtree (keys)} < \text{node (key)} \leq \text{right_subtree (keys)}$

Applications of BSTs

- **Dictionary and spell checker applications:** BSTs can be used to store dictionaries, where searching for a word is reduced to searching a BST.
- **Database indexing:** BSTs can be used as an index to quickly search for specific values in large databases.
- **Priority Queues:** BSTs can be used to implement priority queues, where elements with the highest or lowest priority can be efficiently retrieved.
- **Graph algorithms:** BSTs can be used to efficiently implement graph algorithms like Dijkstra's shortest path algorithm.

Traversal in BSTs

Pre-Order

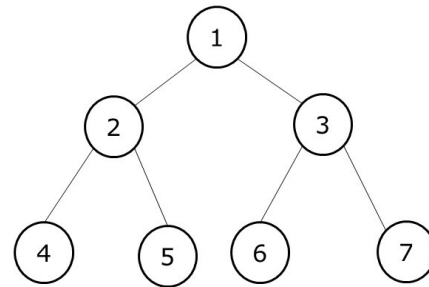
The root node is visited last, hence the name. First, we traverse the left subtree, then the right subtree and finally the root node.

Post-Order

The root node is visited first, then the left subtree and finally the right subtree.

In-Order

The left subtree is visited first, then the root and later the right sub-tree. We should always remember that every node may represent a subtree itself.



Preorder [1,2,4,5,3,6,7]

Inorder [4,2,5,1,6,3,7]

Postorder [4,5,2,6,7,3,1]

Operations with BSTs

Searching

- Whenever an element is to be searched, start searching from the root node.
- Then if the data is less than the key value, search for the element in the left subtree.
- Otherwise, search for the element in the right subtree.
- Follow the same algorithm for each node.

Complexity: ?

Insertion/Deletion

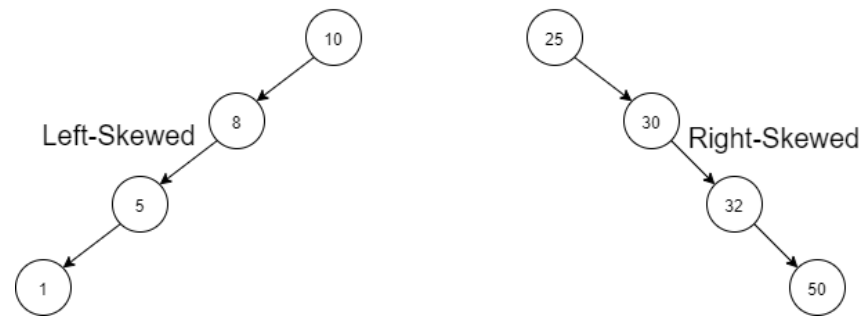
- Start searching from the root node.
- Then if the data is less than the key value, search for the (empty if inserting) location in the left subtree and insert/delete the data.
- Otherwise, search for the (empty if inserting) location in the right subtree and insert/delete the data.

Complexity: ?

Complexities

OPERATION	WORST CASE	AVERAGE CASE	BEST CASE	SPACE
Search	$O(N)$	$O(\log N)$	$O(1)$	$O(N)$
Insert	$O(N)$	$O(\log N)$	$O(1)$	$O(N)$
Delete	$O(N)$	$O(\log N)$	$O(N)$	$O(N)$

Skewed Binary Search Tree



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IMPLEMENTATION

https://colab.research.google.com/drive/1RC3ybT-gLdITq79ucm__VJqi126iU5Ls?usp=sharing

QUESTIONS?

