

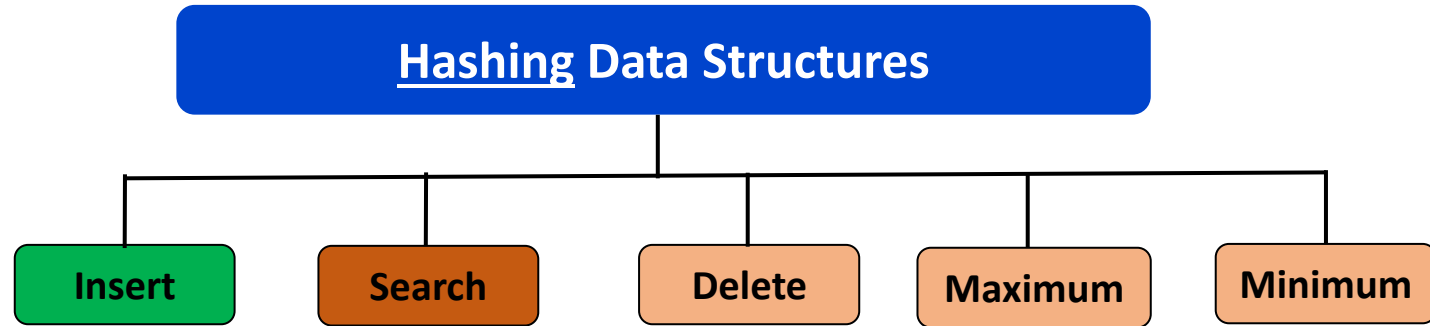
CS2x1:Data Structures and Algorithms

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Hashing (1)

Tables



Elements of Hashing:

- i. Hash Table → contains the key values with pointers to the corresponding records
- ii. Hash Function
- iii. Collisions
- iv. Collision Resolution Techniques

Hash Function

A “good” hash function minimizes the probability of collisions

$H: K \rightarrow I$

Hash Functions:

- Division method
- Midsquare method
- Folding method
- Multiplication method

$H(k) = k \bmod m$; $k \rightarrow$ key, $m \rightarrow$ table size; if index start from 0

$H(k) = k \bmod m + 1$; if index start from 1

Collision Resolution Technique:

- Open addressing/Closed hashing
 - Linear probing method
 - Quadratic probing method
 - Double hashing method
- Closed addressing/Open hashing
 - Chaining

K	I
10	1
19	0
35	8
43	7
62	8
59	4
31	4
49	3
77	4
33	6

Hash Function

0	19
1	10
2	
3	49
4	59, 31, 77
5	
6	33
7	43
8	35, 62
9	

Hash Table

Exercise: Division method

A **hash table of size 11** using the hash function **$h(x) = x \bmod 11$** . The key values are given in the following order: 44, 45, 46, 47, 33, and 55.

*When we use Linear Probing for collision resolution, what is the index value of **key 55**, if the index value starts from 0 ?*

$$h'(k) = k \bmod m ; k \rightarrow \text{key}, m \rightarrow \text{table size};$$

$$H(k, i) = (h'(k) + i) \bmod m; i \rightarrow \{0, 1, 2, \dots, m-1\}$$

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	
10	

Exercise: Division method (1)

A **hash table of size 11** using the hash function **$h(x) = x \bmod 11$** . The key values are given in the following order: 41, 27, 9, 21, 22, 23, 34, and 45.

*When we use Quadratic Probing for collision resolution, what is the index value of **key 45**, if the index value starts from 0 ?*

$$h'(k) = k \bmod m ; k \rightarrow \text{key}, m \rightarrow \text{table size};$$

$$H(k, i) = (h'(k) + i^2) \bmod m; i \rightarrow \{0, 1, 2, \dots, m-1\}$$

0	22
1	23
2	34
3	
4	
5	
6	
7	
8	41
9	9
10	21

Exercise: Division method (2)

A **hash table of size 11** using the hash function **$h(x) = x \bmod 11$** . The key values are given in the following order: 41, 27, 9, 21, 13, 22, 23, 26, 2, and 30.

When we use Double hashing for collision resolution where:

$$h_1(x) = x \bmod 11$$

$$h_2(x) = x \bmod 11$$

what is the index value of **key 30**, if the index value starts from 0 ?

$$h_1(k) = k \bmod m ; k \rightarrow \text{key}, m \rightarrow \text{table size};$$

$$h_2(k) = k \bmod m';$$

$$h(k) = (h_1(k) + i * h_2(k)) \bmod m; i \rightarrow \{0, 1, 2, \dots, m-1\}$$

0	22
1	23
2	13
3	2
4	26
5	27
6	
7	
8	41
9	9
10	21

Hash Function: Generalization

$h_1(k) = k \bmod m$; $k \rightarrow \text{key}$, $m \rightarrow \text{table size}$;

$h_2(k) = k \bmod m'$;

$h(k) = (h_1(k) + F(i)) \bmod m$; $i \rightarrow \{0, 1, 2, \dots, m-1\}$

Hash Table

0	
1	
2	
3	
4	
5	
6	
7	
8	
9	

Hash Function: Midsquare

$$H(k) = x;$$

where x is obtained by selecting the appropriate number of bits or digits from the middle of the square of the key value k

Keys (k): 1234

2345

3456

k^2 : 1522756

5499025

11943936

Policy (selection criteria): select 3 digits at even positions from the right most digit in the square

$H(k)$: 525

492

933

Keys (k): 1234

2345

3456

k^2 : 1522756

5499025

11943936

Policy (selection criteria): select middle digit (r) bits or digits \rightarrow range : 0 to $2^r - 1$

$H(k)$: 2

9

3

Exercise: Midsquare

Keys 101,121,131,141,151 are inserted into a hash Table of size 10 (0–9) using the midsquare hash function and linear probing is used for collision resolution. **Use the middle digit of the square of the key value.** What is the index into which 151 will be inserted?

- A. 2
- B. 8
- C. 9
- D. 6

Keys (k):	101	121	131	141	151
k ² :	10 <u>2</u> 01	14 <u>6</u> 41	17 <u>1</u> 61	19 <u>8</u> 81	22 <u>8</u> 01

Policy (selection criteria): select middle digit (r) bits or digits → range : 0 to 2^r - 1

H(k):	2	6	1	8	8
-------	---	---	---	---	---

$H(k) = x + i;$
 $i \rightarrow \{0, 1, 2, ..., m - 1\}$

$H(151, i=0) = (8+0) \rightarrow \text{Collision}$
 $H(151, i=1) = (8+1)$

Hash Table

0	
1	131
2	101
3	
4	
5	
6	121
7	
8	141
9	

Hash Function: Folding

$$H(k) = k_1 + k_2 + k_3 + \dots + k_n;$$

When the key is a large number, key is partitioned into multiple parts such as k_1 k_2 k_3 ... k_n

Note: if the keys are in binary form, the exclusive-OR operation may be substituted in place of addition

Keys (k):	1522756	5499025	11943936
Chopping:	01 52 27 56	05 49 90 25	11 94 39 36
Pure folding:	$01 + 52 + 27 + 56 = 136$	$05 + 49 + 90 + 25 = 169$	$11 + 94 + 39 + 36 = 180$
Fold shifting: [$k_1, k_3, k_5 \dots$]	$10 + 52 + 72 + 56 = 190$	$50 + 49 + 09 + 25 = 133$	$11 + 94 + 93 + 36 = 234$
Fold boundary: [k_1, k_n]	$10 + 52 + 27 + 65 = 154$	$50 + 49 + 90 + 52 = 241$	$11 + 94 + 39 + 63 = 207$

Exercise: Folding

Consider the following keys are inserted into a hash Table of size 10 (0–9) using the [folding hash function](#) and [Linear Probing is used for collision resolution](#).

Keys (k): 4765, 7052, 6745, 6574, 7502

What is the index into which 6574 will be inserted?

Keys (k):	4764	7052	6745	6574	7502
Chopping:	47 64	70 52	67 45	65 74	75 02
Pure folding:	$47 + 64 = 111$	$70 + 52 = 122$	$67 + 45 = 112$		$75 + 02 = 79$

$$H(k) = k_1 + k_2 + k_3 + \dots + k_n;$$

When the key is a large number, key is partitioned into multiple parts such as k_1 k_2 k_3 ... k_n

Note: if the keys are in binary form, the exclusive-OR operation may be substituted in place of addition

Hash Function: Multiplication

$$H(k) = \lfloor m * (kA \bmod 1) \rfloor; k \rightarrow \text{key}, 0 < A < 1$$

$kA \bmod 1 \rightarrow \text{fractional}$

$$A = 0.1952; \text{Key}(k) = 5; m = 5$$

$$kA = 0.976$$

$$\begin{aligned} H(5) &= \lfloor m * (kA \bmod 1) \rfloor \\ &= \lfloor 5 * (0.976 \bmod 1) \rfloor \\ &= \lfloor 5 * 0.976 \rfloor \\ &= \lfloor 4.88 \rfloor \\ &= 4 \end{aligned}$$

$$\begin{aligned} H(10) &= \lfloor m * (kA \bmod 1) \rfloor \\ &= \lfloor 5 * (1.952 \bmod 1) \rfloor \\ &= \lfloor 5 * 0.952 \rfloor \\ &= \lfloor 4.76 \rfloor \\ &= 4 \rightarrow \text{Collision} \end{aligned}$$

\rightarrow apply linear probing or any other collision resolution techniques

Drawbacks: Open addressing → Closed hashing

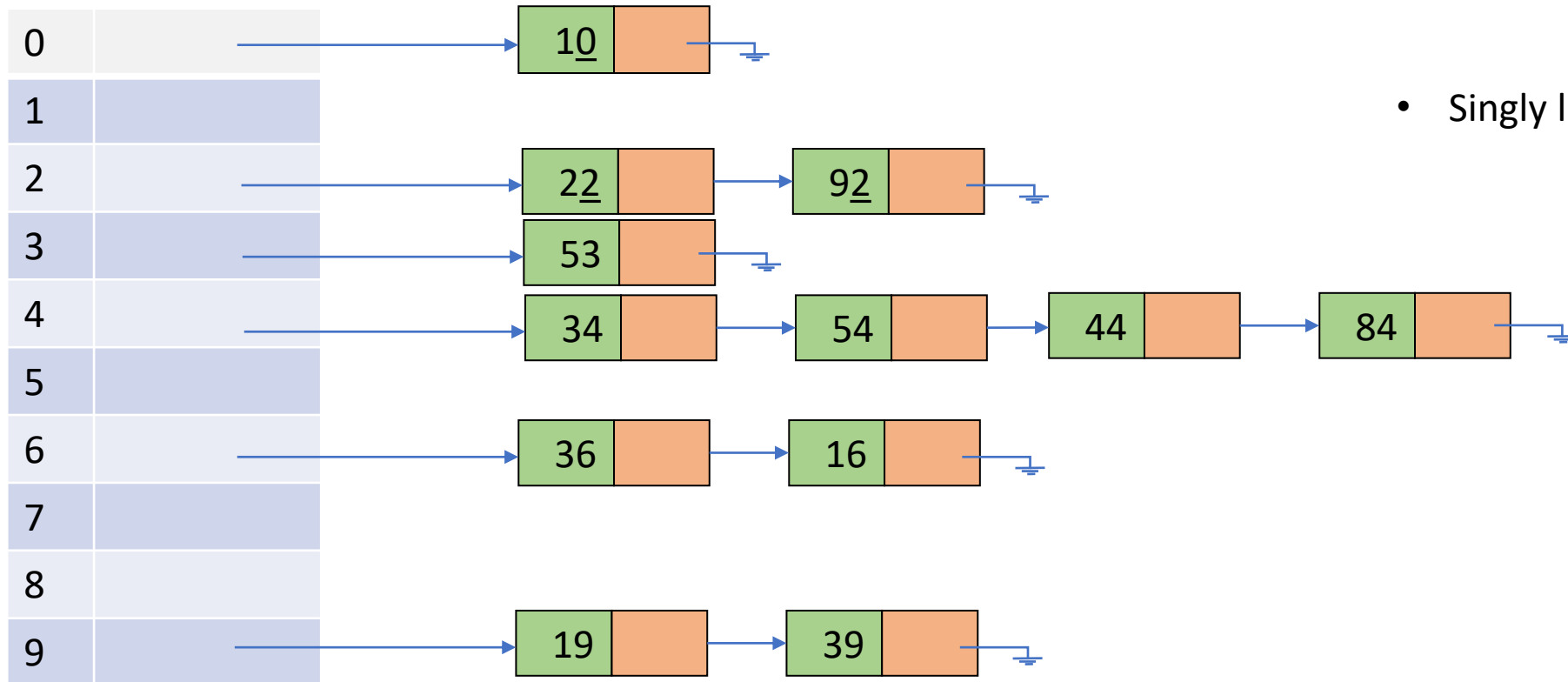
- *All the key values are stored in the hash tables*
- *The closed hashing mostly deals with array-based implementation for hash tables*
 - *Difficult to handle the situation of hash table overflows*
 - *The majority of the keys far from their hash location → increasing the number of probes → decreases the overall performance*

To resolve the closed hashing problem → Open hashing (separate chaining or simply chaining)

Open hashing

- *Open hashing is also called as separate chaining or simply chaining*
- *Chaining method uses a hash table as an array of pointers \rightarrow each pointer points to a linked list*

Table size = 10; Policy: $H(k) \rightarrow$ the last digit of the key values



- Singly linked list

Advantages and disadvantages of chaining

- An overflow scenario never arises. The hash table is not restricted with the size, hence it can hold any number of key values
- Collision resolution can be achieved very efficiently, if the list maintained an ordering of keys → keys can be searched quickly
- Insertion and deletion becomes a quick and easy task in open hashing. Deletion of a key follows the same way of deleting a node in a singly linked list
- Open hashing is best suitable in applications where the number of keys values varies drastically → due to dynamic storage management policy
- *Open hashing required an additional storage space for maintaining linked lists and its link fields.*

Comparison of Collision Resolution Techniques

- Analytical comparison of various collision resolution techniques is measured by using load factor

$$\text{load factor } \alpha = \frac{\text{Total number of key values}}{\text{Size of the hash table}} = \frac{n}{m}$$

Arrays: Operations

Index:	a[0]	a[1]	a[2]	a[3]							a[n-1]
--------	------	------	------	------	--	--	--	--	--	--	--------

10	20	30	40	101
-----------	-----------	-----------	-----------	--------------	--------------	-------------	------------

❖ Insertion

- ✓ Best case : Insertion at the end $\rightarrow \Omega(1)$
- ✓ Worst case : Insertion at the beginning $\rightarrow O(n)$
- ✓ Average case : Insertion in middle $\rightarrow \theta(n)$

❖ Deletion

- ✓ Best case : Deletion at the end $\rightarrow \Omega(1)$
- ✓ Worst case : Deletion at the beginning $\rightarrow O(n)$
- ✓ Average case : Deletion in middle takes $\theta(n)$

❖ Traversal/lookup

- ✓ Direct access : 0 (1) [can access any element with base address]

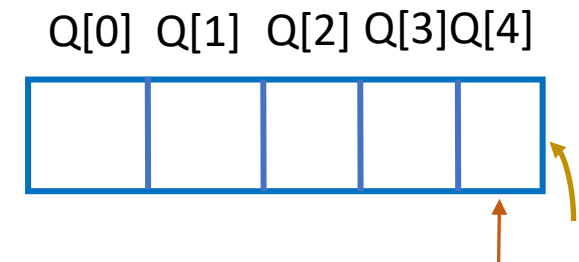
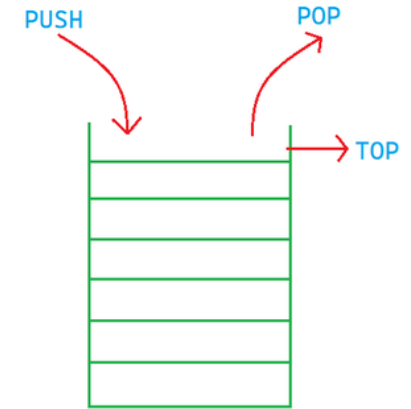
Stack and Queue: Operations

❖ Stack Operations

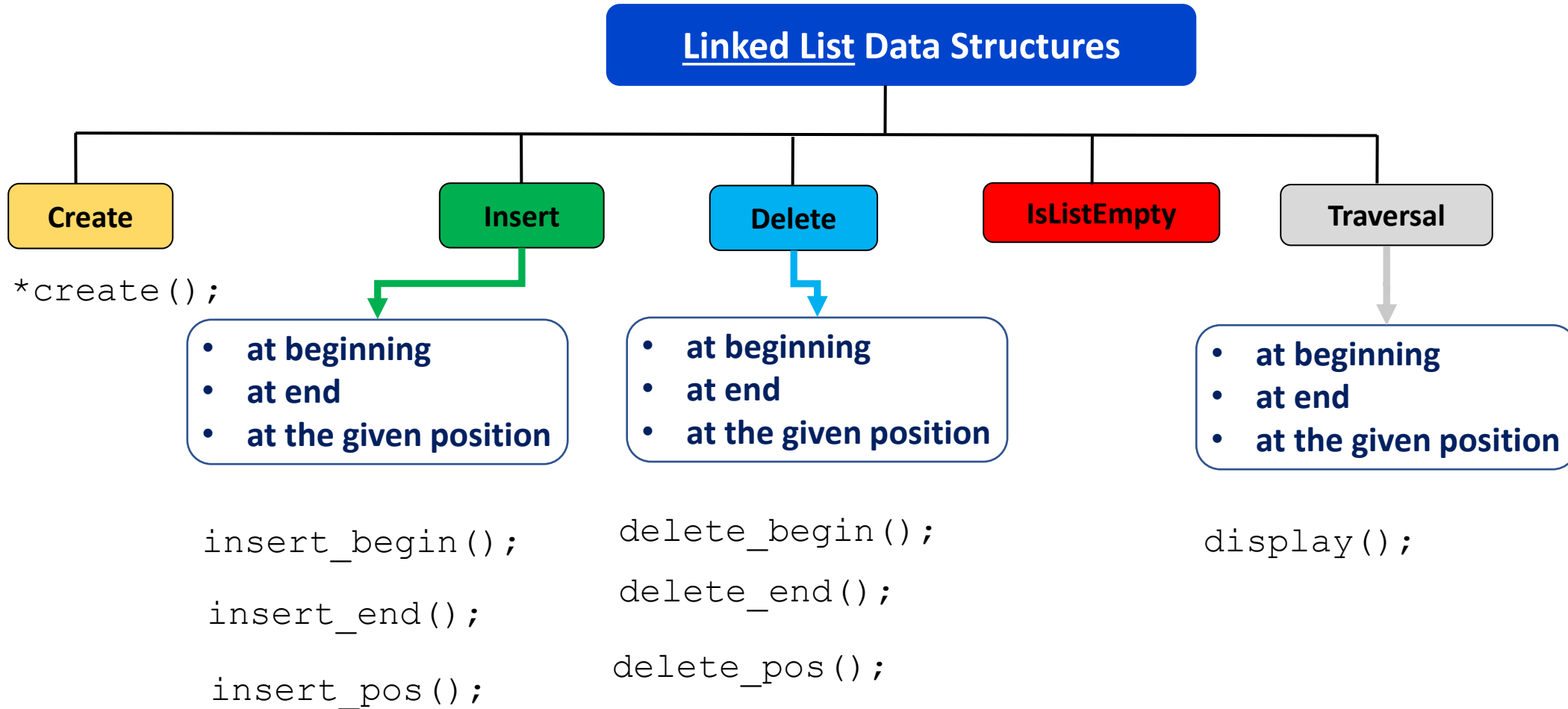
- ✓ Push : Insertion at the top $\rightarrow O(1)$
- ✓ Pop : Delete from the top $\rightarrow O(1)$
- ✓ IsEmpty : Exception handling $\rightarrow O(1)$
- ✓ IsFull : Exception handling $\rightarrow O(1)$

❖ Queue Operations

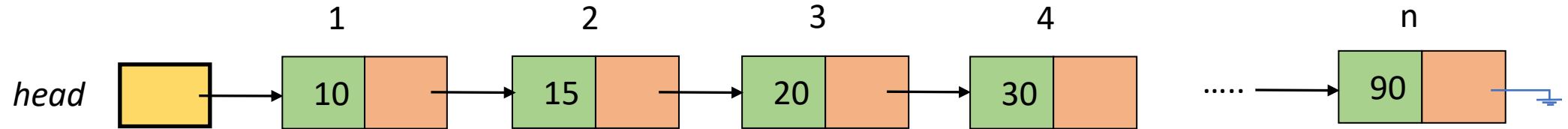
- ✓ EnQueue : Insertion at the tail $\rightarrow O(1)$
- ✓ DeQueue : Delete from the front $\rightarrow O(1)$
- ✓ IsEmpty : Exception handling $\rightarrow O(1)$
- ✓ IsFull : Exception handling $\rightarrow O(1)$



Linked List: Operations



Singly Linked List: Traversal



traversal

① `struct node *traversal`

② `traversal = head;`

③ `while (traversal != NULL)`

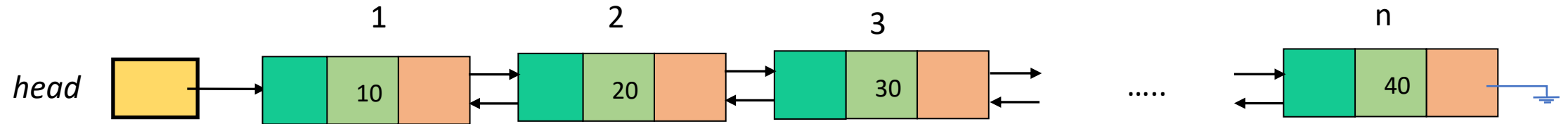
`display the element: traversal → data`

`traversal = traversal → next`

Time Complexity $O(n)$ → for visiting the list of size n

Space Complexity $O(1)$ → for creating a temporary variable → traversal

Doubly Linked List: Traversal



traversal

① `struct node *traversal`

② `traversal = head;`

③ `while (traversal != NULL)`

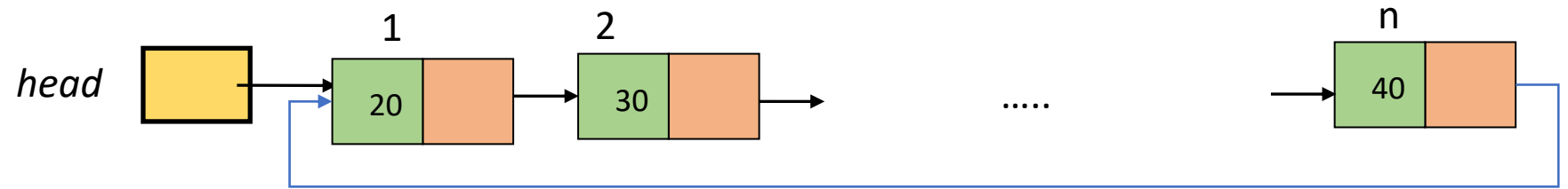
`display the element: traversal → data`

`traversal = traversal → next`

Time Complexity $O(n)$ → for visiting the list of size n

Space Complexity $O(1)$ → for creating a temporary variable → traversal


Circular Singly Linked List: Traversal



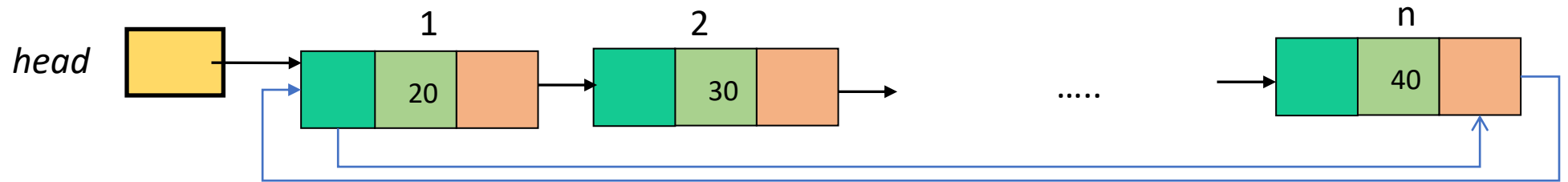
traversal

Time Complexity $O(n)$ \rightarrow for visiting the list of size n

Space Complexity $O(1)$ \rightarrow for creating a temporary variable \rightarrow traversal

- ① `struct node *traversal` traversal 
- ② `traversal = head;`
- ③ `while (traversal \rightarrow next \neq head)`
 display the element: traversal \rightarrow data
 traversal = traversal \rightarrow next
- ④ `display the last element: traversal \rightarrow data`


Circular Doubly Linked List: Traversal



traversal

Time Complexity $O(n)$ \rightarrow for visiting the list of size n

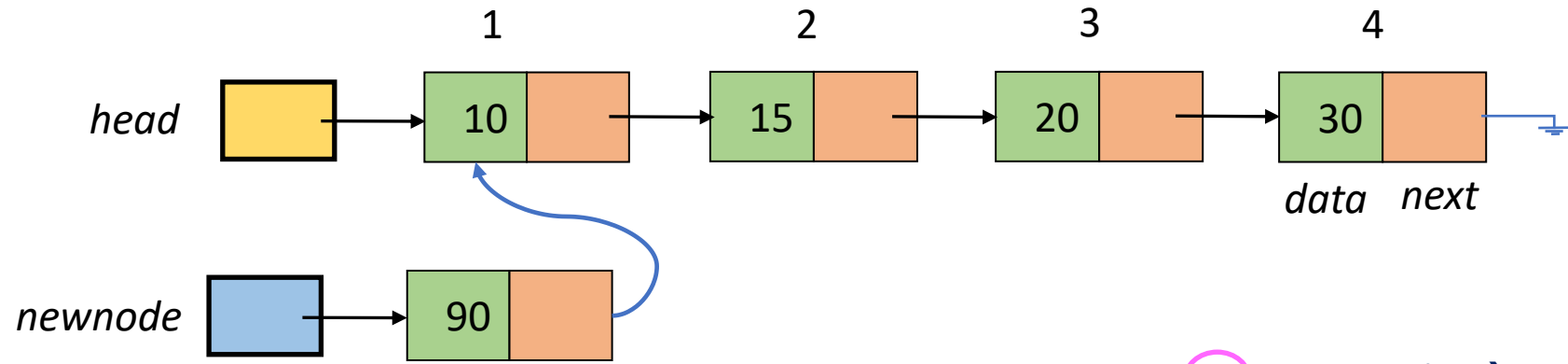
Space Complexity $O(1)$ \rightarrow for creating a temporary variable \rightarrow traversal

- ① `struct node *traversal` traversal 
- ② `traversal = head;`
- ③ `while (traversal \rightarrow next \neq head)`
 display the element: traversal \rightarrow data
 traversal = traversal \rightarrow next
- ④ `display the last element: traversal \rightarrow data`

Linked List: Traversal

Linked Lists Traversal Operation	Time Complexity analysis
Singly Linked List	$O(n)$
Doubly Linked List	$O(n)$
Circular Singly Linked List	$O(n)$
Circular Doubly Linked List	$O(n)$

Singly Linked List: Insert at the beginning



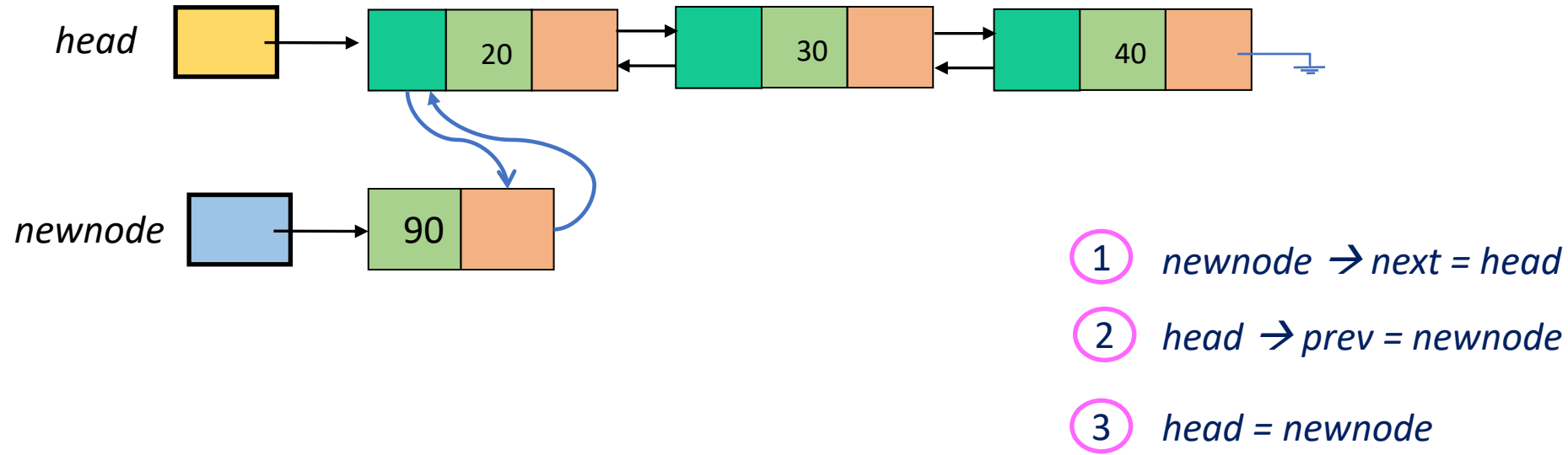
① $newnode \rightarrow next = head$

② $head = newnode$

Time Complexity $O(1)$ \rightarrow for modifying the above two steps

Space Complexity $O(1)$ \rightarrow for creating a newnode

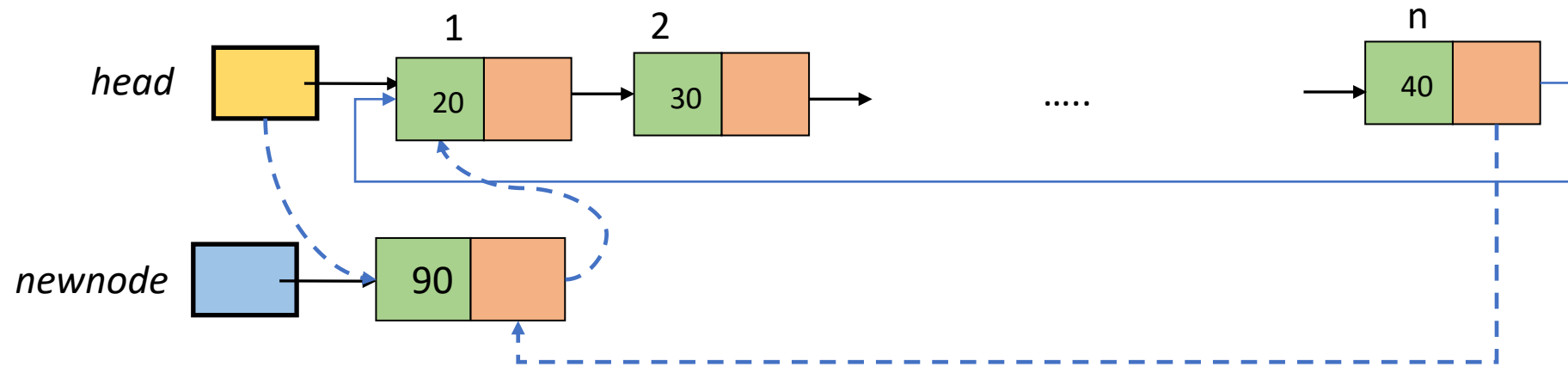
Doubly Linked List: Insert at the beginning



Time Complexity $O(1)$ \rightarrow for modifying the above two steps

Space Complexity $O(1)$ \rightarrow for creating a newnode

Circular Singly Linked List: Insert at the beginning

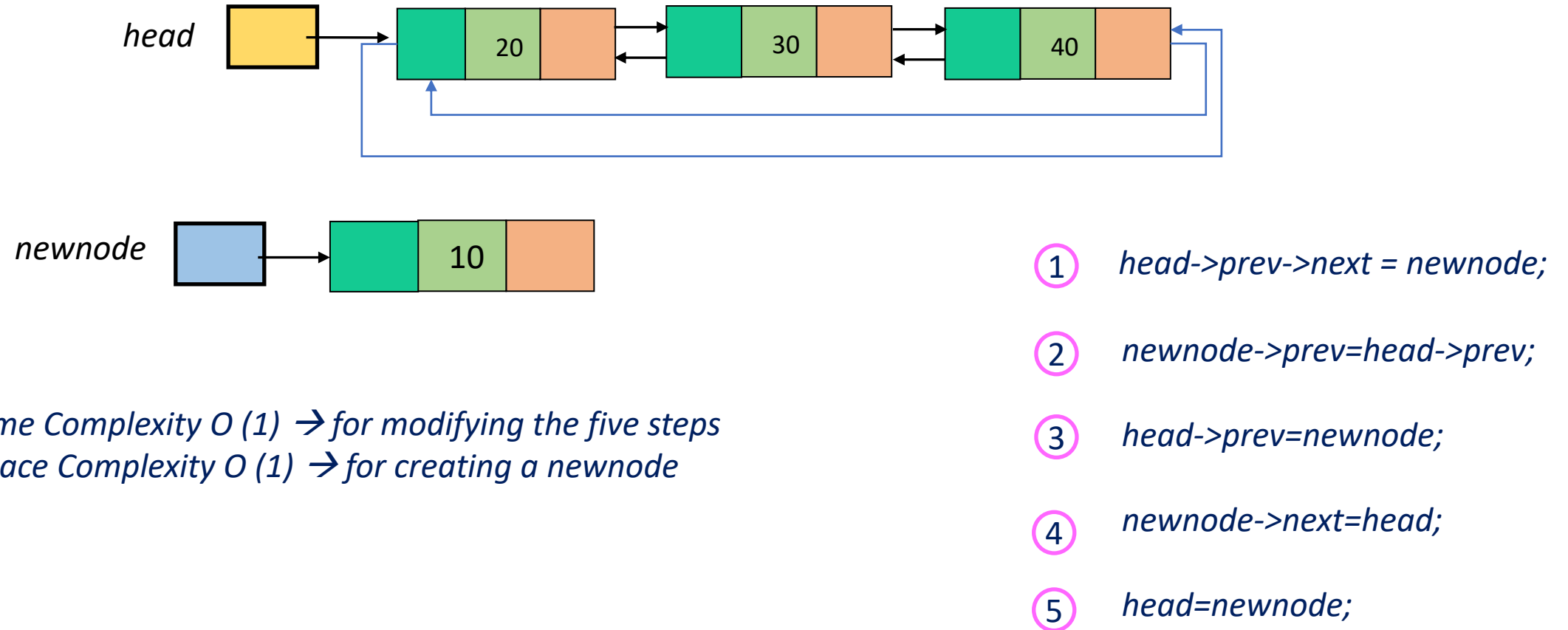


Time Complexity $O(n)$ \rightarrow for traversing the complete list of size n

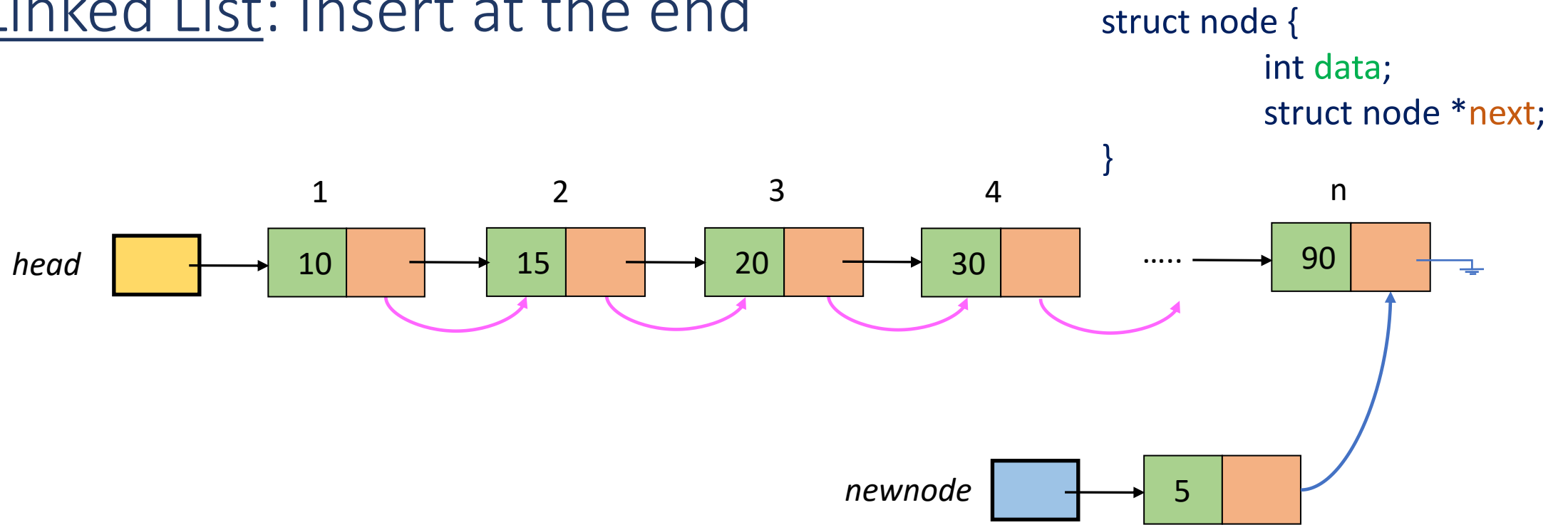
Space Complexity $O(1)$ \rightarrow for creating a newnode

- ① *$begin = head$
 $while (begin \rightarrow next \neq head)$
 $begin = begin \rightarrow next$*
- ② *$begin \rightarrow next = newnode;$*
- ③ *$newnode \rightarrow next = head;$*
- ④ *$head = newnode;$*

Circular Doubly Linked List: Insert at the beginning



Singly Linked List: Insert at the end



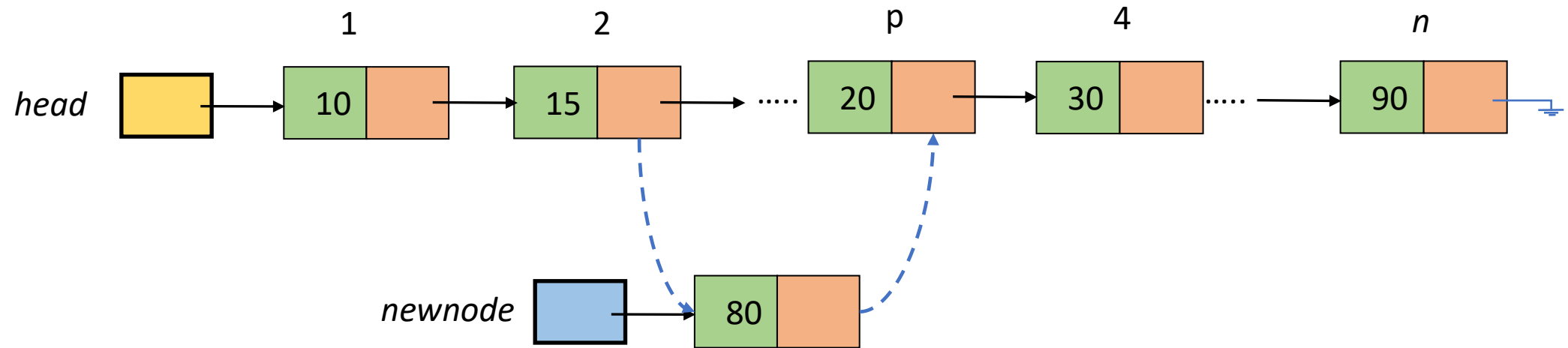
Time Complexity $O(n)$ \rightarrow for visiting the list of size n

Space Complexity $O(1)$ \rightarrow for creating a newnode

① while (tail \rightarrow next \neq NULL)
 tail = tail \rightarrow next

Singly Linked List: Insert at the given position

```
struct node {  
    int data;  
    struct node *next;  
}
```



Time Complexity $O(n)$ → In the worst case, it may happen that we need to insert at the end

Space Complexity $O(1)$ → for creating a newnode

Linked List: Insertion

Linked Lists <i>Insertion at the beginning</i> Operation	Time Complexity analysis
Singly Linked List	$O(1)$
Doubly Linked List	$O(1)$
Circular Singly Linked List	$O(n)$
Circular Doubly Linked List	$O(1)$

Linked Lists <i>Insertion at the end</i> Operation	Time Complexity analysis
Singly Linked List	$O(n)$
Doubly Linked List	$O(n)$
Circular Singly Linked List	$O(n)$
Circular Doubly Linked List	$O(1)$

Linked List: Deletion

Linked Lists <i><u>Deletion at the beginning</u></i> Operation	Time Complexity analysis
Singly Linked List	$O(1)$
Doubly Linked List	$O(1)$
Circular Singly Linked List	$O(n)$
Circular Doubly Linked List	$O(1)$

Linked Lists <i><u>Deletion at end</u></i> Operation	Time Complexity analysis
Singly Linked List	$O(n)$
Doubly Linked List	$O(n)$
Circular Singly Linked List	$O(n)$
Circular Doubly Linked List	$O(1)$

Binary Tree

Time complexity analysis:

❖ Insertion

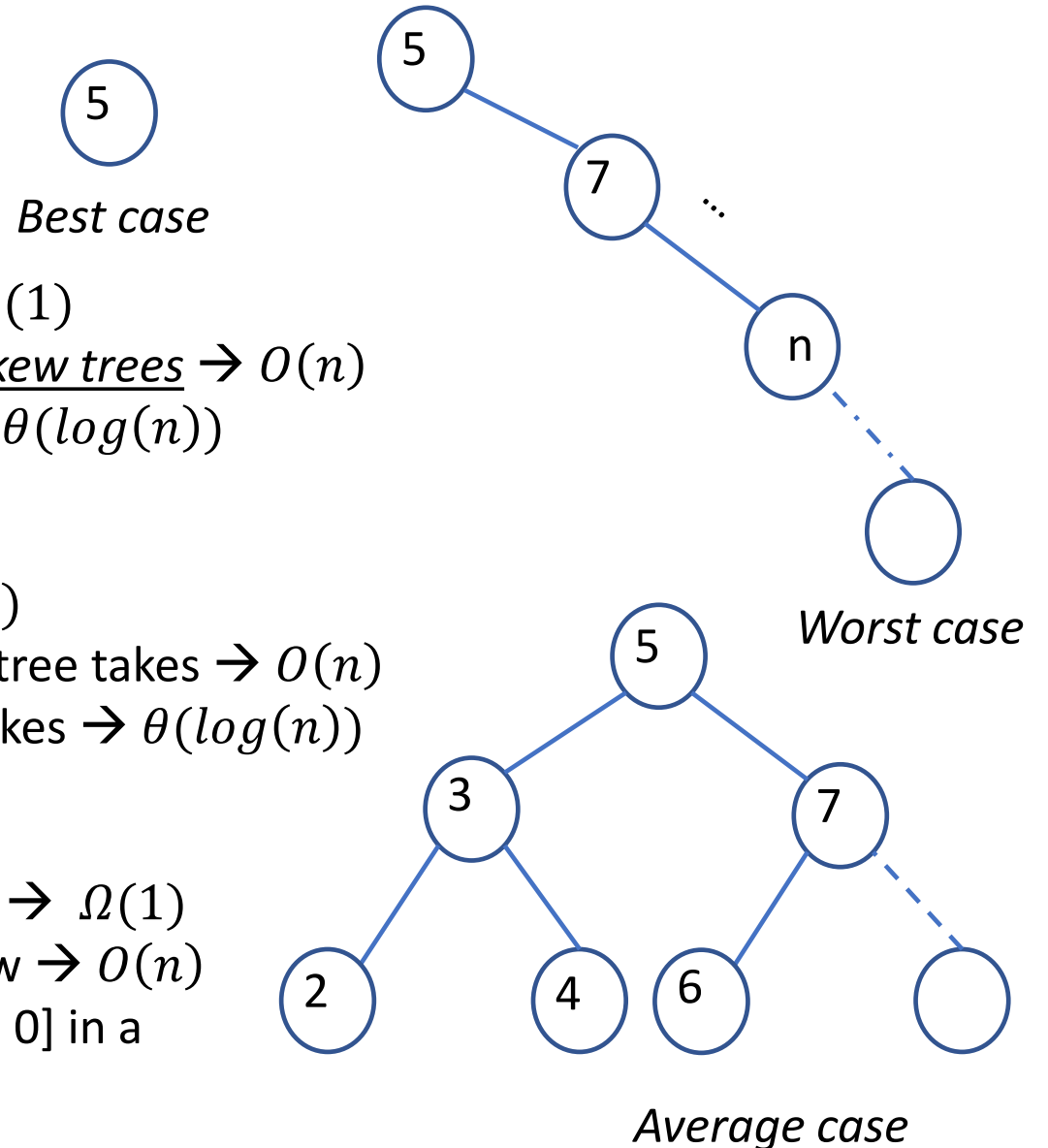
- ✓ Best case : Insertion at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : Insertion in any of Left/Right skew trees $\rightarrow O(n)$
- ✓ Average case : Insertion in a balanced tree $\rightarrow \theta(\log(n))$

❖ Search

- ✓ Best case : Found at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : For any of the Left/Right skew tree takes $\rightarrow O(n)$
- ✓ Average case : Searching in a balanced tree takes $\rightarrow \theta(\log(n))$

❖ Deletion

- Best case : Deletion at the root node takes $\rightarrow \Omega(1)$
- Worst case : Leaf node of any Left/Right skew $\rightarrow O(n)$
- Average case : Deletion of a node [except level 0] in a balanced tree $\rightarrow \theta(\log(n))$ time



Binary tree

Time complexity analysis:

Operation	Best Case	Average Case	Worst Case
Insert	$\Omega(1)$	$\theta(\log(n))$	$O(n)$
Search	$\Omega(1)$	$\theta(\log(n))$	$O(n)$
Deletion	$\Omega(1)$	$\theta(\log(n))$	$O(n)$

Binary Search Tree

Time complexity analysis:

❖ Insertion

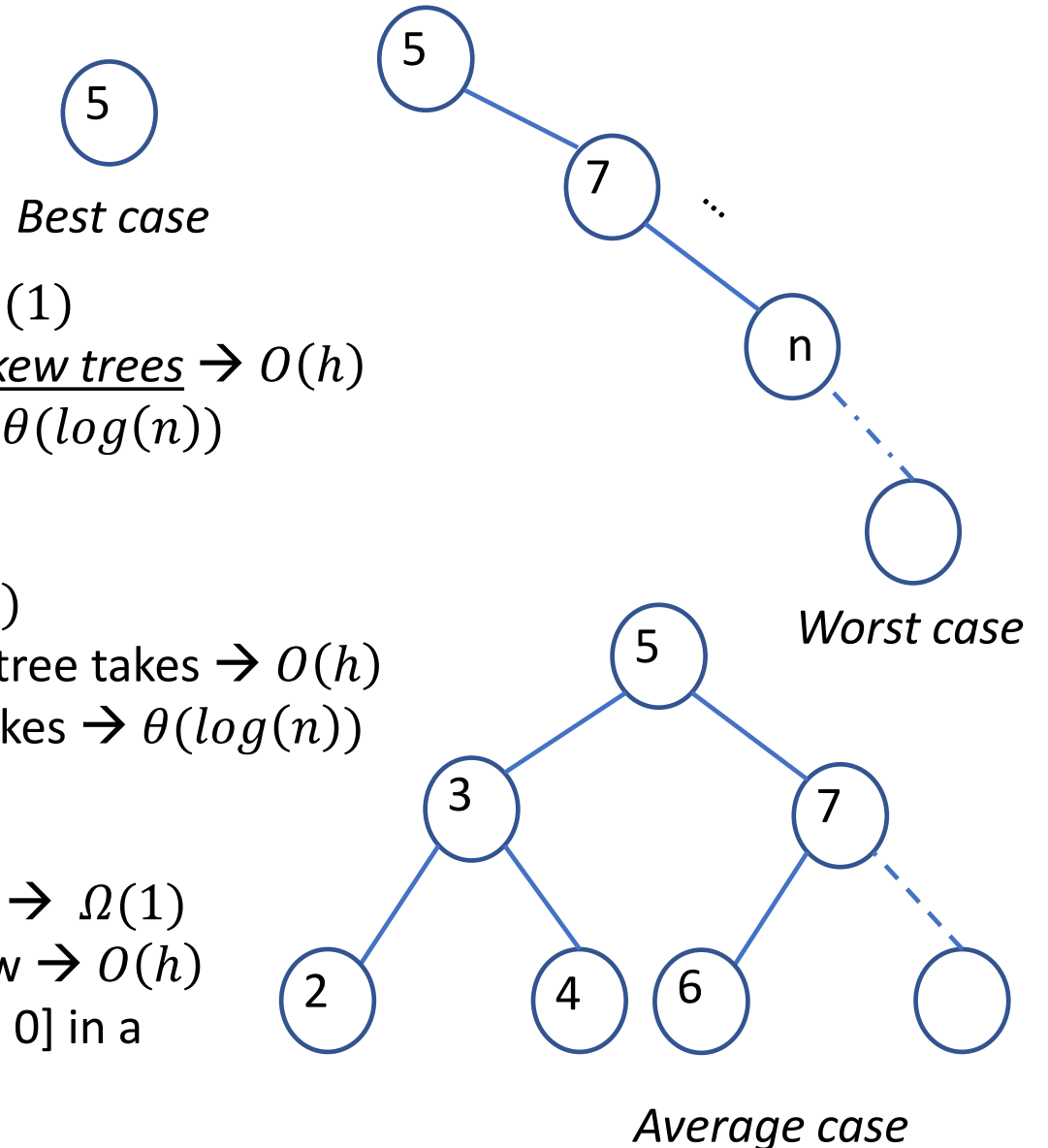
- ✓ Best case : Insertion at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : Insertion in any of Left/Right skew trees $\rightarrow O(h)$
- ✓ Average case : Insertion in a balanced tree $\rightarrow \theta(\log(n))$

❖ Search

- ✓ Best case : Found at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : For any of the Left/Right skew tree takes $\rightarrow O(h)$
- ✓ Average case : Searching in a balanced tree takes $\rightarrow \theta(\log(n))$

❖ Deletion

- Best case : Deletion at the root node takes $\rightarrow \Omega(1)$
- Worst case : Leaf node of any Left/Right skew $\rightarrow O(h)$
- Average case : Deletion of a node [except level 0] in a balanced tree $\rightarrow \theta(\log(n))$ time



Binary Search tree

Time complexity analysis:

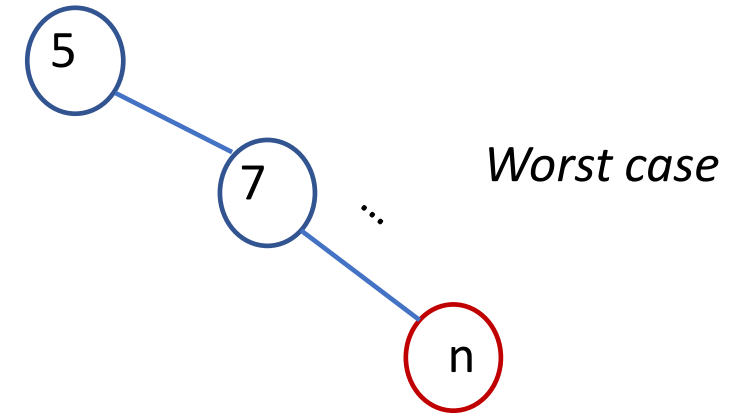
Operation	Best Case	Average Case	Worst Case
Insert	$\Omega(1)$	$\theta(\log(n))$	$O(h)$
Search	$\Omega(1)$	$\theta(\log(n))$	$O(h)$
Deletion	$\Omega(1)$	$\theta(\log(n))$	$O(h)$

AVL Tree

Time complexity analysis:

❖ Insertion

- ✓ Best case : Insertion at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : Insertion trees $\rightarrow O(\log(n))$
- ✓ Average case : Insertion in a balanced AVL tree $\rightarrow \theta(\log(n))$

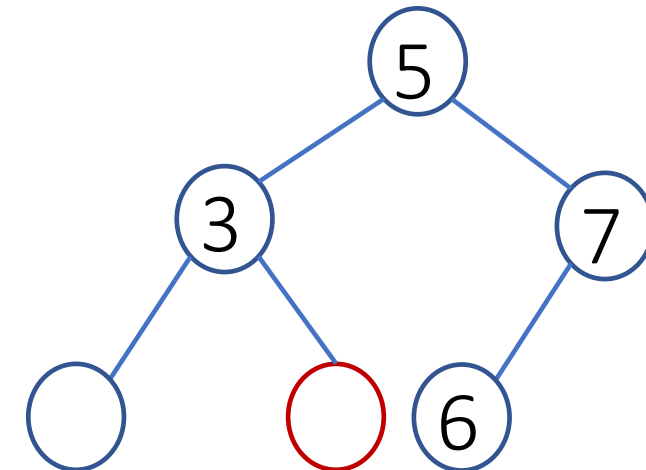


❖ Search

- ✓ Best case : Found at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : The AVL tree takes $\rightarrow O(\log(n))$
- ✓ Average case : Searching in a balanced tree $\rightarrow \theta(\log(n))$

❖ Deletion

- ✓ Best case : Deletion at the root node $\rightarrow \Omega(1)$
- ✓ Worst case : Leaf node of any AVL tree $\rightarrow O(\log(n))$
- ✓ Average case : Deletion of a node in an AVL tree $\rightarrow \theta(\log(n))$



AVL Tree

Time complexity analysis:

Operation	Best Case	Average Case	Worst Case
Insert	$\Omega(1)$	$\theta(\log n)$	$O(\log n)$
Search	$\Omega(1)$	$\theta(\log n)$	$O(\log n)$
Deletion	$\Omega(1)$	$\theta(\log n)$	$O(\log n)$

Binary Heap Tree

Time complexity analysis:

❖ Insertion

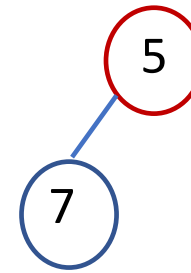
- ✓ Best case : Insertion nearer to the root node $\rightarrow \Omega(1)$
- ✓ Worst case : Insertion heap tree $\rightarrow O(\log(n))$
- ✓ Average case : Insertion heap tree $\rightarrow \theta(\log(n))$

❖ Search

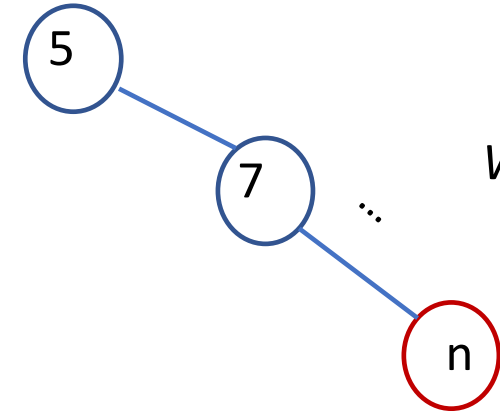
- ✓ Best case : Found at the root node $\rightarrow \Omega(1)$ (Max-heap or Min-heap)
- ✓ Worst case : Searching the last leaf node in the heap tree takes $\rightarrow O(n)$
- ✓ Average case : Searching for n^{th} node in the heap tree $\rightarrow \theta(n)$

❖ Deletion

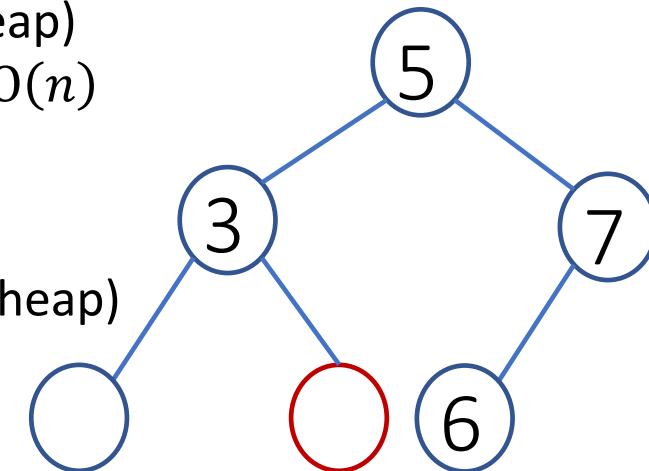
- ✓ Best case : Deletion at the root node $\rightarrow \Omega(1)$ (Max-heap or Min-heap)
- ✓ Worst case : Leaf node of any heap tree $\rightarrow O(\log(n))$
- ✓ Average case : Deletion of a node in a heap tree $\rightarrow \theta(\log(n))$



Best case



Worst case



Average case

Binary Heap Tree

Time complexity analysis:

Operation	Best Case	Average Case	Worst Case
Insert	$\Omega(1)$	$\theta(\log n)$	$O(\log n)$
Search	$\Omega(1)$	$\theta(n)$	$O(n)$
Deletion	$\Omega(1)$	$\theta(\log n)$	$O(\log n)$

thank you!

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