

# Introduction to Computer Science

## Lecture 7: DATA ABSTRACTIONS

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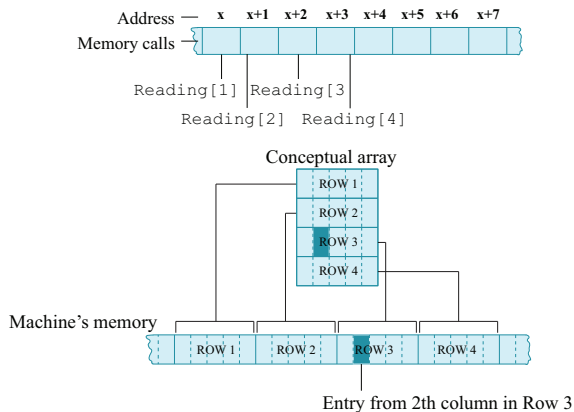
# Data Structure Fundamentals

- Arrays
  - Homogeneous
  - Heterogeneous
- Lists
  - Storage
    - Contiguous lists (arrays)
    - Linked lists
  - Operations
    - Stacks: FILO
    - Queues: FIFO
- Trees
  - Binary search tree
- Binary heaps

# Data Structure Concepts

- Abstraction vs. real data
- Dynamic vs. static structures
- Pointers: locating data
  - Program counter → instruction pointer
- Data structure implementation

# Homogeneous Arrays



**Address polynomial:**  $x + c \cdot (i - 1) + (j - 1)$

High-dimensional arrays: array of (array of ...) arrays.

# Array Addresses

$x = 1000$

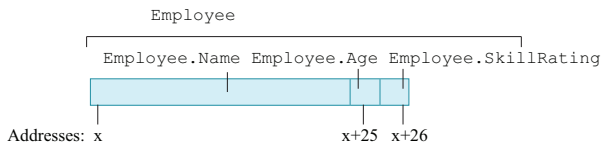
$x[0] = 1000$	$x[0][0]$ 1000	$x[0][1]$ 1004	$x[0][2]$ 1008	$x[0][3]$ 1012
$x[1] = 1016$	$x[1][0]$ 1016	$x[1][1]$ 1020	$x[1][2]$ <b>1024</b>	$x[1][3]$ 1028
$x[2] = 1032$	$x[2][0]$ 1032	$x[2][1]$ 1036	$x[2][2]$ 1040	$x[2][3]$ 1044

`int x[3][4]`

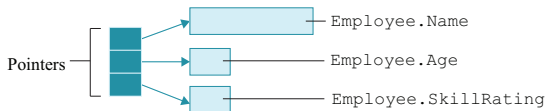
$x[1][2] \rightarrow 1000 + 1 * 4 * 4 + 2 * 4 \rightarrow 1016 (x[1]) + 8 \rightarrow 1024$

`sizeof(int): 4`

# Heterogeneous Arrays



**a.** Array stored in a contiguous block



**b.** Array components stored in separate locations

Using pointers to locate separate data

# Template Functions & Classes

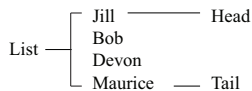
```
int Add(const int a, const int b) {  
    return (a+b);  
}
```

```
template <class T>  
T Add(const T& a, const T& b) {  
    return (a+b);  
}
```

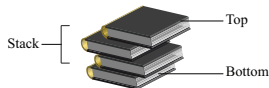
```
Complex<double> var;
```

```
template <class T>  
class Complex {  
public:  
    Complex (const T&, const T&);  
private:  
    T re;  
    T im;  
};
```

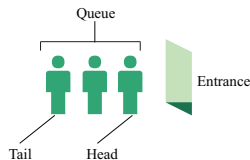
# Lists, Stacks, and Queues



**a.** A list of names



**b.** A stack of books



**c.** A queue of people



# Linear List as C++ Abstract Class

```
template <class T>
class linearList
{
public:
    virtual ~linearList() {};
    virtual bool empty() const = 0;
        //return true iff list is empty
    virtual int size() const = 0;
        //return the number of elements in list
    virtual T& get(int _index) const = 0;
        //return element whose index is _index
    virtual int indexOf(const T& _element) const = 0;
        //return the index of first occurrence of _element
    virtual void erase(int _index) = 0;
        //remove the element whose index is _index
    virtual void insert(int _index, const T& _element) = 0;
        //insert _element so that its index is _index
    virtual void output(ostream& out) const = 0;
        //insert list into stream out
}
```

# Storing Lists

- Contiguous list (array)
  - Pros: easy to implement, excellent choice for static use.
  - Cons: time consuming for dynamic use, fragment may occur without carefully implementation.
- Linked list
  - Head pointer: Indicating the start.
  - NIL pointer (NULL pointer): Indicating the end.

# Singly Linked Lists: Memory Layout

- Layout of  $L = (a, b, c, d, e)$  using an array representation.

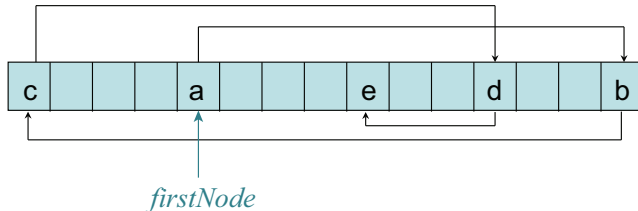


- A linked representation uses an arbitrary layout.

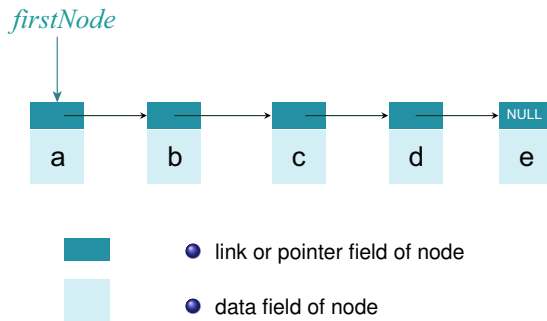


# Linked Representation

- Use a variable *firstNode* to get to the first element *a*
- Pointer (or link) in *e* is *NULL*

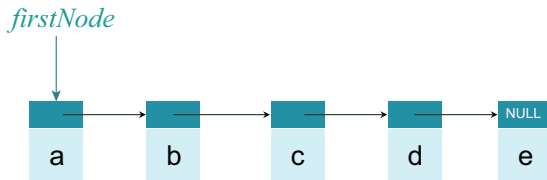


# Normal Way To Draw a Linked List



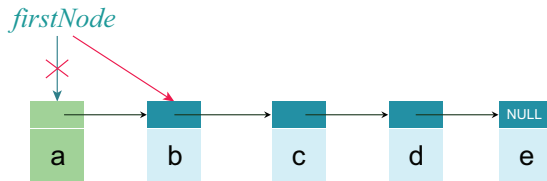
# list::get(int \_index)

- Start from the first node.
- get(2)
  - *desiredNode* = *firstNode* → *next* → *next*; // get to the 3<sup>rd</sup> node
  - return *desiredNode* → *element*;



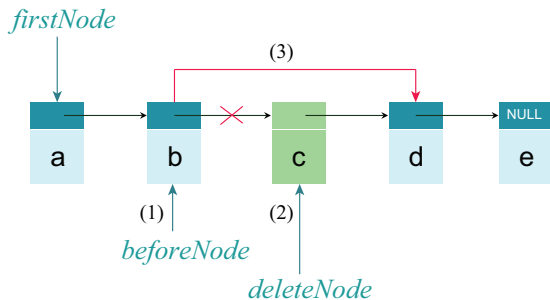
# list::erase(0)

- Special case: need to change *firstNode*



# list::erase(2)

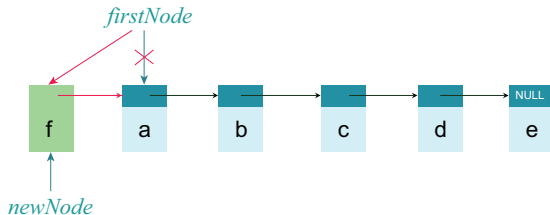
- 1 First get the *beforeNode*
- 2 Identify the *deleteNode*
- 3 Then change pointer in *beforeNode*





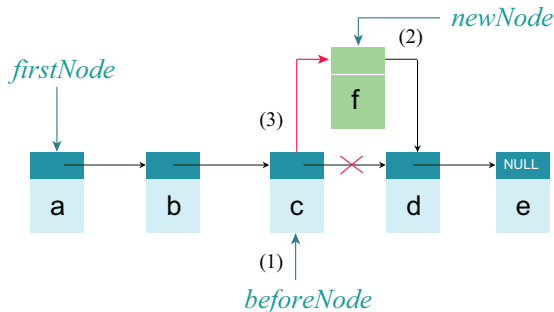
# list::insert(0, 'f')

- Get a node, set its data and link fields
- Update *firstNode*



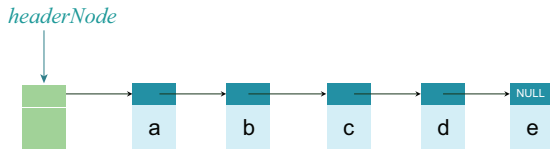
# list::insert(3, 'f')

- 1 Find *beforeNode*
- 2 Create a node and set its data/link fields.
- 3 Link *beforeNode* to *newNode*

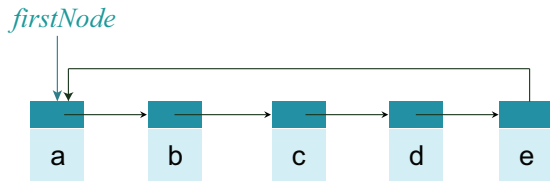


# Variations

- List with a header node (dummy).



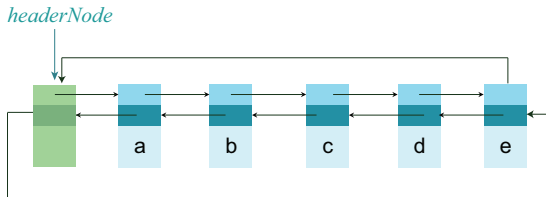
- Circular list



# Doubly Linked Circular List with Header

- STL class `std::list`

- Doubly linked circular list with header node.
- Has many more methods than our list.



# STL list

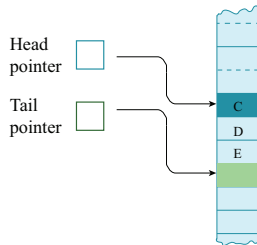
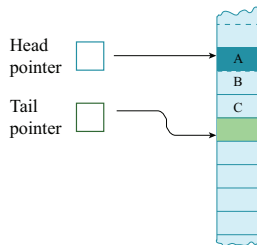
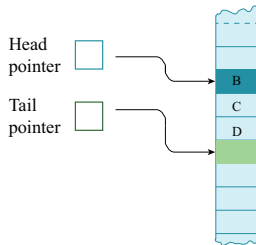
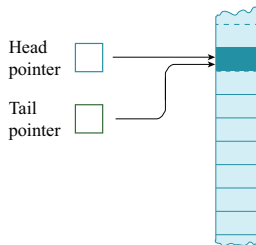
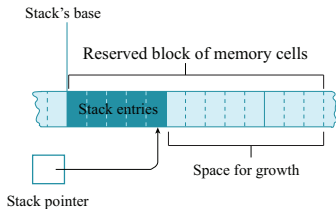
- `#include <list>`
- `size()`
- `push_front()`, `push_back()`
- `pop_front()`, `pop_back()`
- <http://www.cplusplus.com/reference/stl/list/>
- iterator
  - Standard way to traverse a STL container

```
list<int> a;  
....  
for (list<int>::iterator it= a.begin(); it != a.end(); ++it) {  
    cout << *it << " ";  
}
```

# Stack & Queue Implementations

- Special cases of linked list
  - Stack: Recording the stack point
  - Queue: Recording head and tail
- Contiguous list
  - Stack: Array with a stack point
  - Circular queue

# Stacks & Queues Implementations (contd.)



# Abstract Stack Class

```

template <class T>
class stack
{
public:
    virtual ~stack() {};
    virtual bool empty() const = 0;
        //return true iff stack is empty
    virtual int size() const = 0;
        //return the number of elements in stack
    virtual T& top() = 0;
        //return reference to the top element
    virtual void pop() = 0;
        //remove the top element
    virtual void push(const T& _element) = 0;
        //insert _element at the top of the stack
}

```



# Derive from Array

- Stack top is either left end or right end.
- `empty()`  $\rightarrow$  `arrayList::empty()`  $\rightarrow \Theta(1)$
- `size()`  $\rightarrow$  `arrayList::size()`  $\rightarrow \Theta(1)$
- `top()`  $\rightarrow$  `get(0)` or `get(size() - 1)`  $\rightarrow \Theta(1)$

a	b	c	d	e									
---	---	---	---	---	--	--	--	--	--	--	--	--	--

# Derive from Array (contd.)

- When top is left end

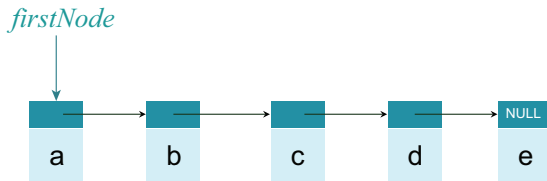
- $\text{push}(\_element) \rightarrow \text{insert}(0, \_element) \rightarrow \Theta(n)$
- $\text{pop}() \rightarrow \text{erase}(0) \rightarrow \Theta(n)$

- When top is right end

- $\text{push}(\_element) \rightarrow \text{insert}(\text{size}(), \_element) \rightarrow \Theta(1)$
- $\text{erase}(\text{size}()-1) \rightarrow \Theta(1)$

# Derive from Linked List

- Stack top is either left end or right end.
- `empty()`  $\rightarrow$  `list::empty()`  $\rightarrow \Theta(1)$
- `size()`  $\rightarrow$  `list::size()`  $\rightarrow \Theta(1)$



# Derive from Linked List (contd.)

- When top is right end
  - $\text{top}() \rightarrow \text{get}(\text{size}()-1) \rightarrow \Theta(n)$
  - $\text{push}(\text{\_element}) \rightarrow \text{insert}(\text{size}(), \text{\_element}) \rightarrow \Theta(n)$
  - $\text{pop}() \rightarrow \text{erase}(\text{size}()-1) \rightarrow \Theta(n)$
- When top is left end
  - $\text{top}() \rightarrow \text{get}(0) \rightarrow \Theta(1)$
  - $\text{push}(\text{\_element}) \rightarrow \text{insert}(0, \text{\_element}) \rightarrow \Theta(1)$
  - $\text{pop}() \rightarrow \text{erase}(0) \rightarrow \Theta(1)$

# Parentheses Matching

(	(	(	a	+	b	)	*	c	+	d	-	e	)	/	(	f	+	g	)	-	(	h	+	j	)	)
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26

- Output pairs  $(u, v)$  such that the left parenthesis at position  $u$  is matched with the right parenthesis at  $v$ 
  - $(2,6), (1,13), (15,19), (21,25), (0,26)$
- Also report missing parentheses
  - $(a+b)^*((c+d)$
  - $(0,4)$ , right parenthesis at 5 has no matching left parenthesis,  
 $(8,12)$ , left parenthesis at 7 has no matching right parenthesis

# Parentheses Matching: Algorithm

- Scan expression from left to right
- When a left parenthesis is encountered, push its position to the stack
- When a right parenthesis is encountered, pop matching position from stack

# Parentheses Matching: Example

(	(	(	a	+	b	)	*	c	+	d	-	e	)	/	(	f	+	g	)	-	(	h	+	j	)	)
0	1	2	3	4	5	6	7	8	9	1	1	1	1	1	1	1	1	1	1	2	2	2	2	2	2	
										0	1	2	3	4	5	6	7	8	9	0	1	2	3	4	5	6



2  
1  
0

Actions

Push 0  
Push 1  
Push 2

Output

# Parentheses Matching: Example (contd.)

(	(	(	a	+	b	)	*	c	+	d	-	e	)	/	(	f	+	g	)	-	(	h	+	j	)	)
0	1	2	3	4	5	6	7	8	9	1	1	1	1	1	1	1	1	1	1	2	2	2	2	2	2	
										0	1	2	3	4	5	6	7	8	9	0	1	2	3	4	5	6



Actions

Push 0  
 Push 1  
 Push 2  
 Pop 2 → Output (2,6)

Output

(2,6)





# Parentheses Matching: Example (contd.)

(	(	(	a	+	b	)	*	c	+	d	-	e	)	/	(	f	+	g	)	-	(	h	+	j	)	)
0	1	2	3	4	5	6	7	8	9	1	1	1	1	1	1	1	1	1	1	2	2	2	2	2	2	
										0	1	2	3	4	5	6	7	8	9	0	1	2	3	4	5	6



Actions

Push 0  
 Push 1  
 Push 2  
 Pop 2 → Output (2,6)  
 Pop 1 → Output (1,13)

Output

(2,6)  
 (1,13)

0

# Parentheses Matching: Example (contd.)

(	(	(	a	+	b	)	*	c	+	d	-	e	)	/	(	f	+	g	)	-	(	h	+	j	)	)
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26



## Actions

Push 0  
 Push 1  
 Push 2  
 Pop 2 → Output (2,6)  
 Pop 1 → Output (1,13)  
 Push 15  
 Pop 15 → Output (15,19)  
 Push 21  
 Pop 21 → Output (21,25)  
 Pop 0 → output (0,26)

## Output

(2,6)  
 (1,13)  
 (15,19)  
 (21,25)  
 (0,26)

# Parentheses Matching: Example (contd.)

(	a	+	b	)	)	*	(	(	c	+	d	)
0	1	2	3	4	5	6	7	8	9	10	11	12



## Actions

Push 0  
 Pop 0 → Output (0,4)  
 Pop → Empty stack!!!

## Output

(0,4)  
 “right parenthesis at 5  
 has no matching left  
 parenthesis”



# Parentheses Matching: Example (contd.)

(	a	+	b	)	)	*	(	(	c	+	d	)
0	1	2	3	4	5	6	7	8	9	10	11	12



7

## Actions

Push 0  
 Pop 0 → Output (0,4)  
 Pop → Empty stack!!!  
 Push 7  
 Push 8  
 Pop 8 → Output (8,12)  
 7 still remains!!!

## Output

(0,4)  
 "right parenthesis at 5  
 has no matching left  
 parenthesis"  
 (8,12)  
 "left parenthesis at 7  
 has no matching right  
 parenthesis"

# Post-order Calculator

- $3 + 4 * 5 \rightarrow 3 \ 4 \ 5 \ * \ +$
- $(3 + 4) * 5 \rightarrow 3 \ 4 \ + \ 5 \ *$
- Algorithm
  - For an operand token, push it into stack
  - For an operator token, pop tokens, operate, then push back the result.

# Post-order Calculator: Example

3	4	+	5	*
Push 3	Push 4	Pop 4 Pop 3 Push 3+4	Push 5	Pop 5 Pop 7 Push 7*5
3	4 3	7	5 7	35

3	4	5	*	+
Push 3	Push 4	Push 5	Pop 5 Pop 4 Push 4*5	Pop 20 Pop 3 Push 3+20
3	4 3	5 4 3	20 3	23

# Abstract Queue Class

```

template <class T>
class queue
{
public:
    virtual ~queue() {};
    virtual bool empty() const = 0;
        //return true iff queue is empty
    virtual int size() const = 0;
        //return the number of elements in queue
    virtual T& front() = 0;
        //return reference to the front element
    virtual T& back() = 0;
        //return reference to the back element
    virtual void pop() = 0;
        //remove the front element
    virtual void push(const T& _element) = 0;
        //add _element at the back of the queue
}

```

# Derive from Array

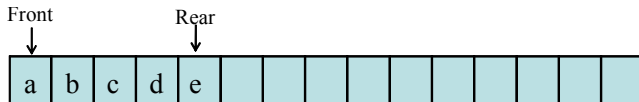
- When front is right end & rear is left end
  - `empty()`  $\rightarrow$  `queue::empty()`  $\rightarrow \Theta(1)$
  - `size()`  $\rightarrow$  `queue::size(0)`  $\rightarrow \Theta(1)$
  - `front()`  $\rightarrow$  `get(size() - 1)`  $\rightarrow \Theta(1)$
  - `back()`  $\rightarrow$  `get(0)`  $\rightarrow \Theta(1)$
  - `pop()`  $\rightarrow$  `erase(size() - 1)`  $\rightarrow \Theta(1)$
  - `push(_element)`  $\rightarrow$  `insert(0, _element)`  $\rightarrow \Theta(n)$





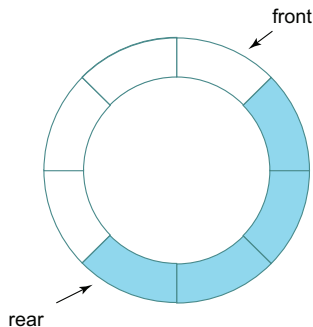
# Derive from Array (contd.)

- When front is left end & rear is right end
  - `empty()`  $\rightarrow$  `queue::empty()`  $\rightarrow \Theta(1)$
  - `size()`  $\rightarrow$  `queue::size()`  $\rightarrow \Theta(1)$
  - `front()`  $\rightarrow$  `get(0)`  $\rightarrow \Theta(1)$
  - `back()`  $\rightarrow$  `get(size()-1)`  $\rightarrow \Theta(1)$
  - `pop()`  $\rightarrow$  `erase(0)`  $\rightarrow \Theta(n)$
  - `push(_element)`  $\rightarrow$  `insert(size(), _element)`  $\rightarrow \Theta(1)$



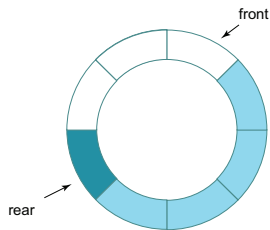
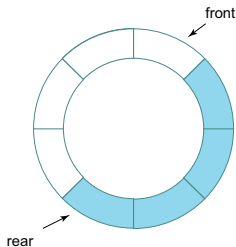
# Can We Do Better?

- To perform each operation in  $\Theta(1)$  time (excluding array doubling), we need a customized array representation.
- Circular.



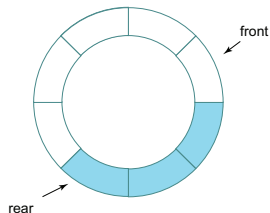
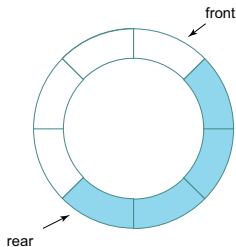
# Push

- 1 Move Rear clockwise.  $rear = (rear + 1) \% arrayLength$
- 2 Then put into  $queue[rear]$



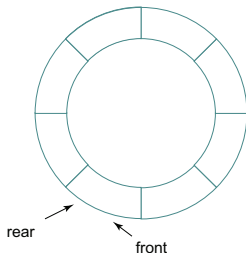
# Pop

- 1 Move Front clockwise.  $front = (front + 1) \% arrayLength$
- 2 Then erase  $queue[front]$

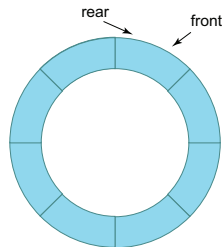


# Empty & Full Queue

An empty queue.

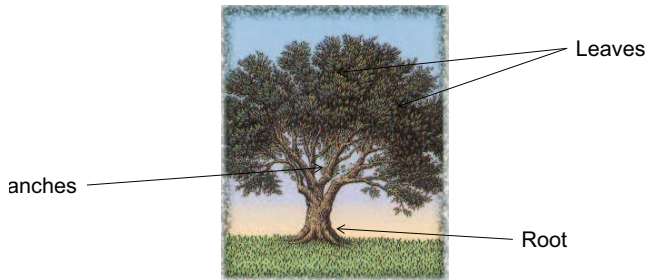


A full queue.

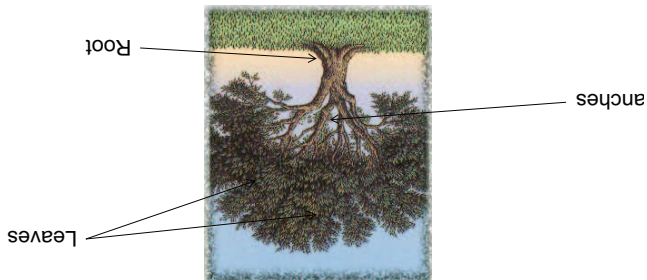


- Both  $front == rear$ .
- Define an integer variable *size*.
  - Following each *push* do  $++ size$ .
  - Following each *pop* do  $-- size$ .
  - Queue is empty iff ( $size == 0$ ).
  - Queue is full iff ( $size == arrayLength$ ).

# Nature Lover's View Of A Tree



# Computer Scientist's View



# Linear Lists And Trees

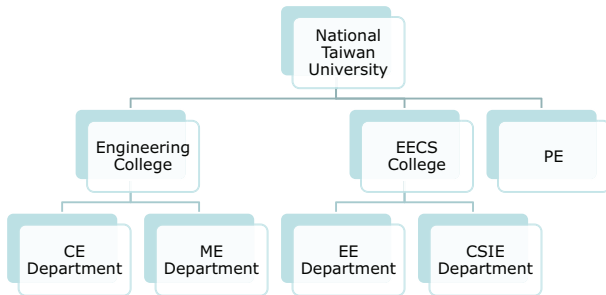
- Linear lists are useful for serially ordered data.
  - $(e_0, e_1, e_2, \dots, e_{n-1})$
  - Days of week.
  - Months in a year.
  - Students in this class.
- Trees are useful for hierarchically ordered data.
  - Employees of a corporation.
    - President, vice presidents, managers, and so on.



# Hierarchical Data and Trees

- The element at the top of the hierarchy is the **root**.
- Elements next in the hierarchy are the **children** of the root.
- Elements next in the hierarchy are the **grandchildren** of the root, and so on.
- Elements that have no children are **leaves**.

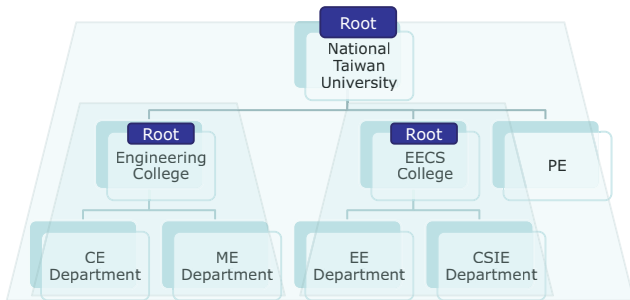
# Example Tree



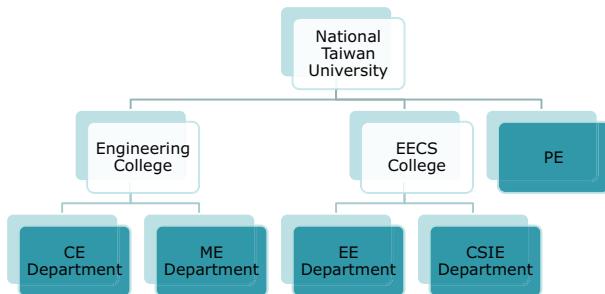
# Definition

- Recursive definition.
- A tree  $t$  is a finite non-empty set of elements.
- One of these elements is called the root.
- The remaining elements, if any, are partitioned into trees, which are called the subtrees of  $t$ .

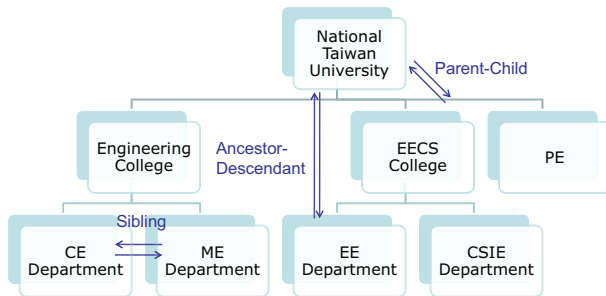
# Example Tree



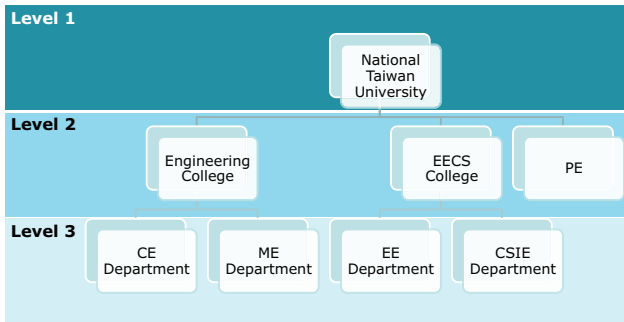
# Leaves



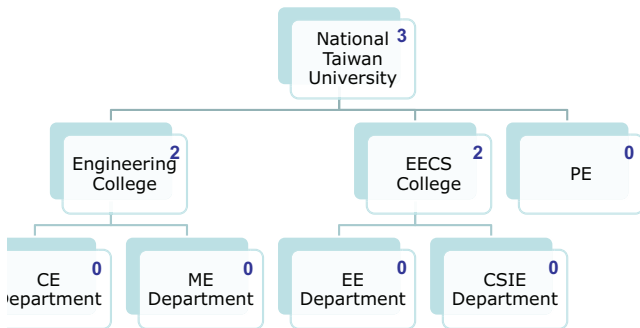
# Parent, Children, Siblings, Ancestors, Descendants



# Levels



# Node Degree = Number Of Children



Tree Degree = Max Node Degree ( =3 )

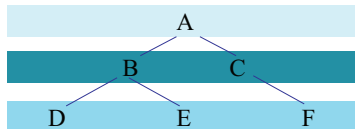


# Binary Trees

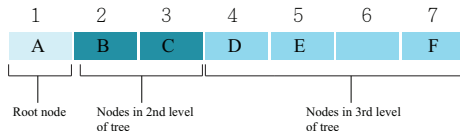
- Finite non-empty collection of elements.
- A binary tree has a **root** element.
- The remaining elements (if any) are partitioned into **two** binary trees.
- These are called the **left** and **right** subtrees.

# Storing Binary Trees without Pointers

## Conceptual tree

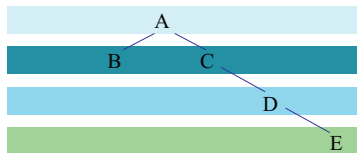


## Actual storage organization

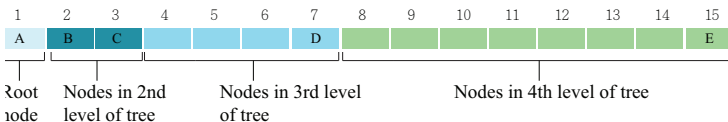


# May Waste Lots of Memories...

## Conceptual tree

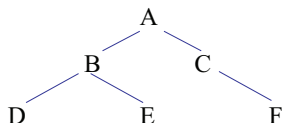


## Actual storage organization

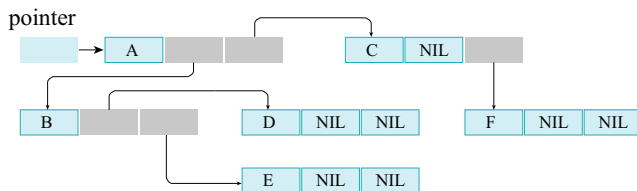


# Storing Binary Trees with Pointers

## Conceptual tree



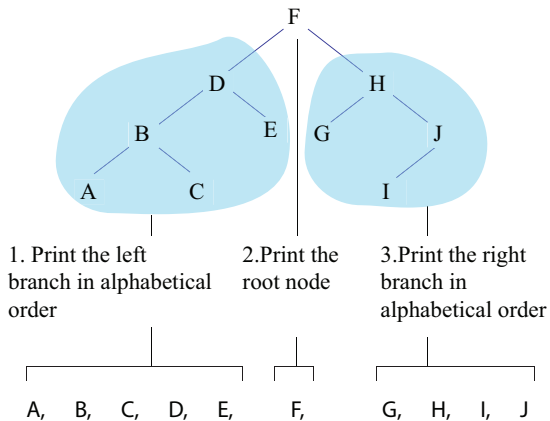
## Actual storage organization



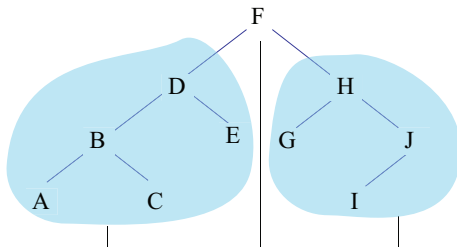
# Definition of Binary Search Tree (BST)

- A binary tree.
- Each node has a (*key, value*) pair.
- For every node *x*, all keys in the left subtree of *x* are smaller than that in *x*
- For every node *x*, all keys in the right subtree of *x* are greater than that in *x*
- Operations
  - Traversal.
  - Search, insertion, deletion.
  - If the tree is balanced, insertion and search takes only  $\Theta(\log n)$  of time, where *n* is the number of nodes.

# Traverse in Order



# Pre-Order and Post-Order



Pre-order: (1) root (2) left (3) right  
F D B A C E H G J I

Post-order: (1) left (2) right (3) root  
A C B E D G I J H F

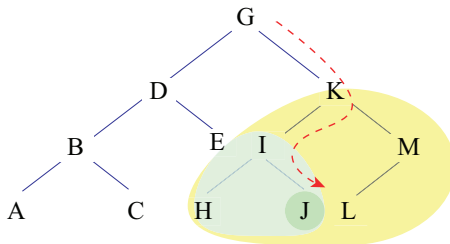
# Pre-Order and Post-Order

- In-order of a BST is always like sorting ascended.
- A BST is **uniquely decided** given its **pre-order** or **post-order** traversal (deciding the root and then splitting nodes into left and right).
- A binary tree is **uniquely decided** given its **pre-order** (or **post-order**) and **in-order** traversals.



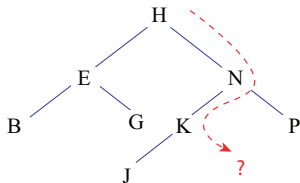
# Search

- Very similar to binary search (may not be half-half).

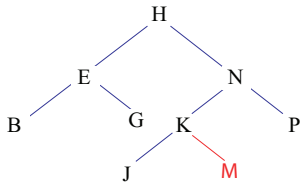


# Insertion

**A.** Search for the new entry until its absence is detected.

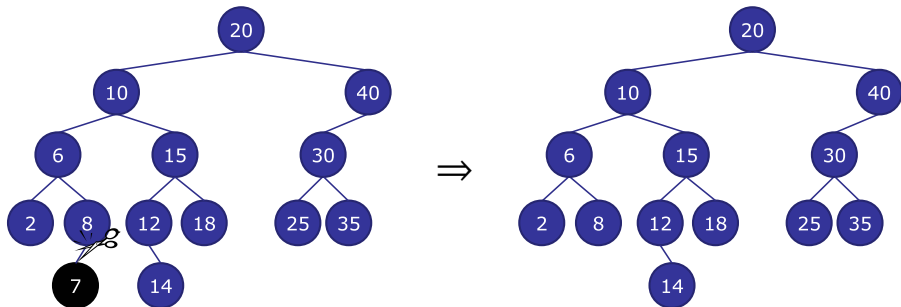


**B.** This is the position in which the new entry should be attached.



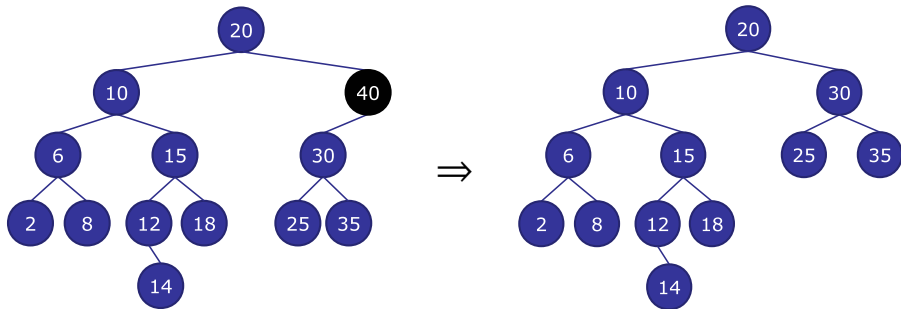
# Delete A Leaf

- Erase a leaf element whose key is 7.



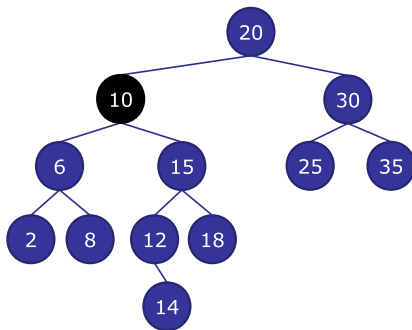
# Delete A Degree-1 Node

- Erase a leaf element whose key is 40.



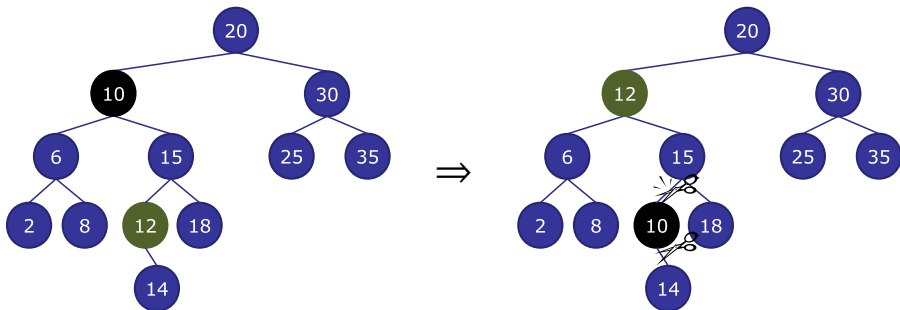
# Delete A Degree-2 Node

- Erase an element whose key is 10.



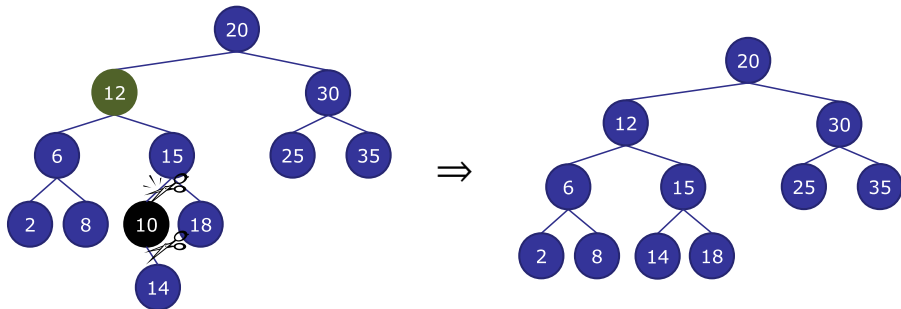
# Delete A Degree-2 Node (contd.)

- Swap it with its successor (or predecessor).
  - The minimum node of the right subtree (keep going left).
  - Or the parent if itself is a left child.



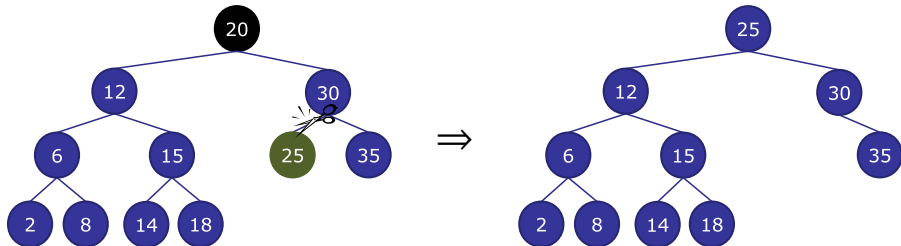
# Delete A Degree-2 Node (contd.)

- Its successor has degree of 1 or 0.
- So simply cut and reconnect the rest of the tree.



# Delete A Degree-2 Node (contd.)

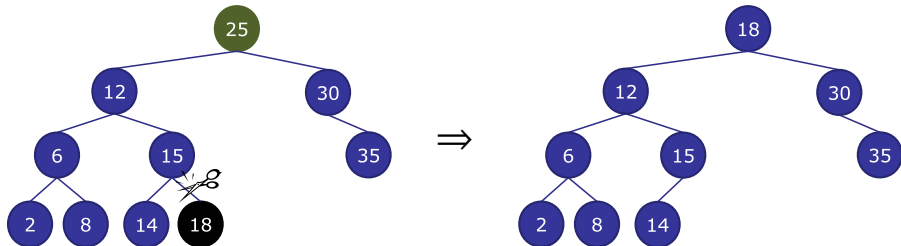
- Erase an element whose key is 20.





# Delete A Degree-2 Node (contd.)

- Erase an element whose key is 18.

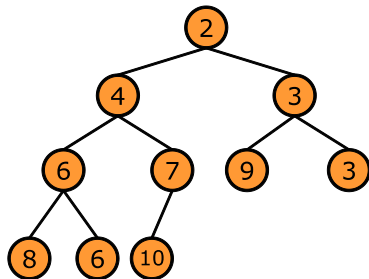


# Priority Queue

- A stack pops the **newest** element.
- A queue pops the **oldest** element.
- What if we want to pop the most **important** element?
- If we associate elements with priorities, we'd like to pop the element with the highest priority.
- That data structure that accomplishes this task is called a **priority queue**.
- A **binary heap** is one method to implement a **priority queue**.

# Binary Min Heap

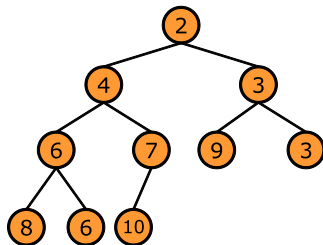
- A complete binary tree.
  - A binary tree in which every level, except possibly the last, is completely filled, and all nodes are as far left as possible.
- A min tree.
  - The key of each parent is no greater than any of its child.



- A min heap with 10 nodes.

# Storing Binary Heap by Array

- The most common way to store a binary heap is by using an **array**.



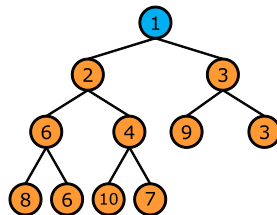
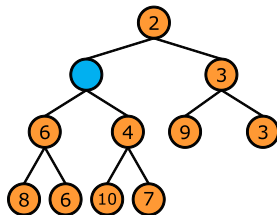
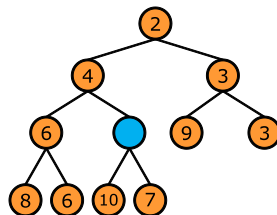
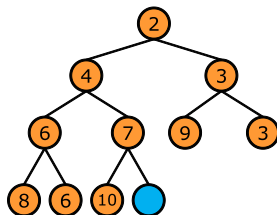
$a[0]$	$a[1]$	$a[2]$	$a[3]$	$a[4]$	$a[5]$	$a[6]$	$a[7]$	$a[8]$	$a[9]$
2	4	3	6	7	9	3	8	6	10

- Traverse with index  $i$ :

Go to parent	Left child	Right child	Sibling
$(i-1)/2$	$2*i+1$	$2*i+2$	even: $i-1$ , odd: $i+1$

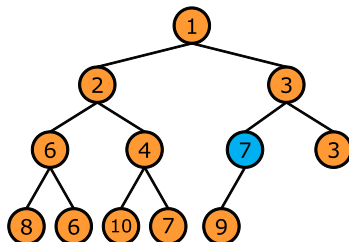
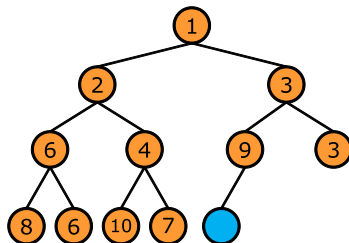
# Push '1'

- The new element is always inserted as the **last** element.
- Then float up as needed.



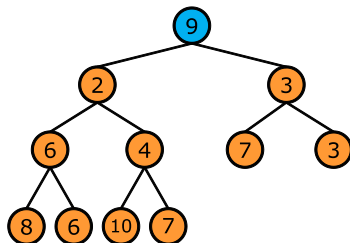
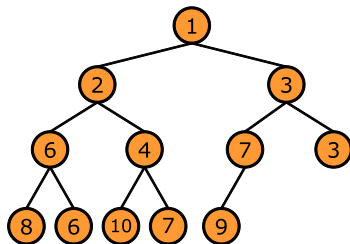
# Push '7'

- The new element is always inserted as the **last** element.
- Then “float” up as needed.



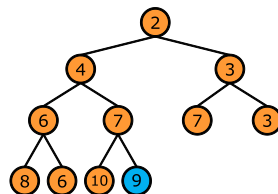
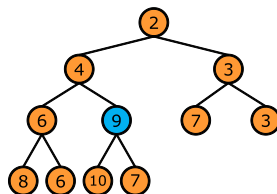
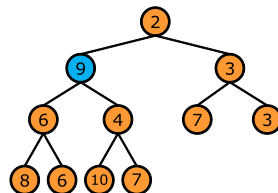
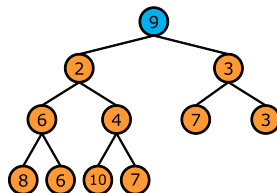
# Pop

- Pop the root (smallest key).
- Replace it with the last element.
- Then “sink” down by choosing the “smaller” path.



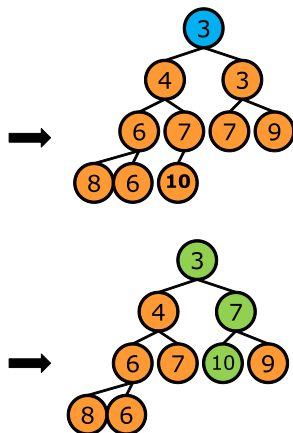
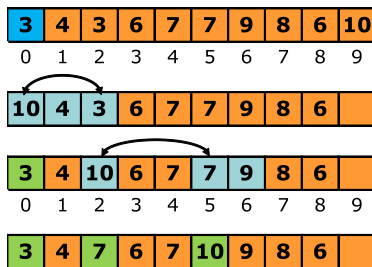
# Pop (contd.)

- Pop the root (smallest key).
- Replace it with the last element.
- Then “sink” down by choosing the “smaller” path.





# Pop Operation in Array



# Complexity of Heap

- For  $n$  elements, the height of the tree is  $\Theta(\log n)$ .
- Time complexity for both push and pop:  $\Theta(\log n)$ .
- We may accomplish sorting (called **HeapSort**) by keeping popping from a min heap:  $\Theta(n \log n)$ .
- We didn't show it, but modifying a key also costs  $\Theta(\log n)$ .