

# CS217 - Data Structures & Algorithm Analysis (DSAA)

## Lecture #8

### ► Elementary Data Structures

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Reading: Part III Introduction & Chapter 10

## ► Aims of this lecture

- To introduce **data structures** and their typical operations.
- **Stacks, queues, priority queues** and **linked lists**.
- To work out the **running time** for operations on these data structures.
- To identify pros and cons for data structures in terms of efficiency.

## ► Data Structures

- **Dynamic sets** that can store and retrieve elements.
- Data structures are techniques for representing finite dynamic sets of elements
- Each element can contain:
  - a **key**, used to identify the element
  - **Satellite data**, carried around but unused by the data structure
  - **Attributes**, that are manipulated by the data structure eg., pointers to other objects
- Often keys stem from a **totally ordered set** (e. g. numbers)
  - Allows to define the minimum, successor and predecessor

## ► Data Structure Operations

- Operations on a dynamic sets  $S$  can be grouped into **queries** and **modifying operations**:
- Typical operations:
  - **Search( $S, k$ )**: returns a pointer  $x$  to the element with **key  $k$** , or NIL
  - **Insert( $S, x$ )**: given a pointer  $x$  to an element adds the element to  $S$
  - **Delete( $S, x$ )**: given a pointer  $x$  to an element removes it from  $S$
  - **Minimum( $S$ ), Maximum( $S$ )**: return pointer  $x$  resp. with smallest or largest key
  - **Successor( $S, x$ ), Predecessor( $S, x$ )**: next larger (smaller) than Key( $x$ )
- **Time** often measured using  $n$  as the number of elements in  $S$ .

## ► Data Structure Operations

- What's the runtime of each operation on an **array**?
- **Search(S, k)**: returns a pointer **x** to the element with **key k**, or NIL  $\Theta(n)$
- **Insert(S, x)**: given a pointer **x** to an element adds the element to S  $\Theta(1)$
- **Delete(S, x)**: given a pointer **x** to an element removes it from S  $\Theta(1)$
- **Minimum(S), Maximum(S)**: return pointer **x** resp. with smallest or largest key  $\Theta(n)$
- **Successor(S, x), Predecessor(S, x)**: next larger (smaller) than Key(x)  $\Theta(n)$

## ► Data Structure Operations

- What's the runtime of each operation on a **sorted array**?  $\Theta(\log n)$
- **Search(S, k)**: returns a pointer **x** to the element with **key k**, or NIL  $\Theta(n)$
- **Insert(S, x)**: given a pointer **x** to an element adds the element to S  $\Theta(n)$
- **Delete(S, x)**: given a pointer **x** to an element removes it from S  $\Theta(n)$
- **Minimum(S), Maximum(S)**: return pointer **x** resp. with smallest or largest key  $\Theta(1)$
- **Successor(S, x), Predecessor(S, x)**: next larger (smaller) than Key(x)  $\Theta(1)$

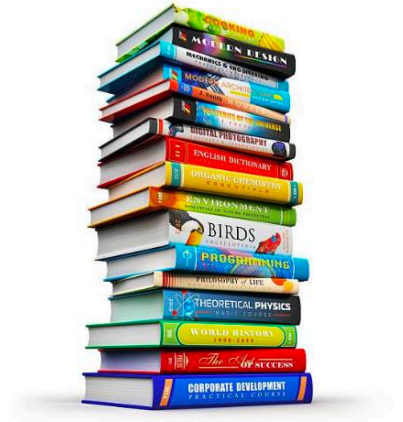
We'll now see some data structures that improve on the array implementation for many of the dynamic-set operations.

## ► Roadmap for the next lectures

- Simple data structures
  - Stacks
  - Queues
  - Linked lists
  - Binary search trees
  - Graphs
- Advanced data structures
  - Balanced trees
  - Priority queues

# ► Stacks

3
6
8



- Only the **top element** is accessible in a stack.
  - Last-in, first-out policy (LIFO)
- Insert is usually called **Push**, and Delete is called **Pop**.





## ► Stacks implemented using arrays

- Stacks can be implemented as an array  $S$  with attribute  $S.top$ .

**PUSH( $S, x$ )**

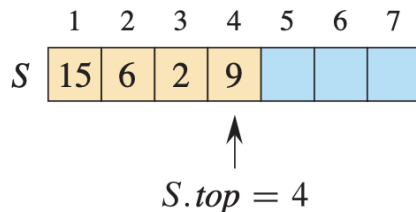
```
1 if  $S.top == S.size$ 
2   error "overflow"
3 else  $S.top = S.top + 1$ 
4    $S[S.top] = x$ 
```

**STACK-EMPTY( $S$ )**

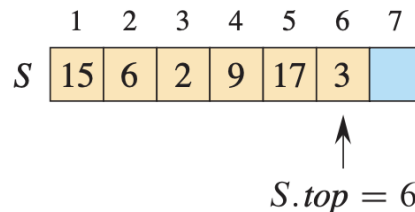
```
1 if  $S.top == 0$ 
2   return TRUE
3 else return FALSE
```

**POP( $S$ )**

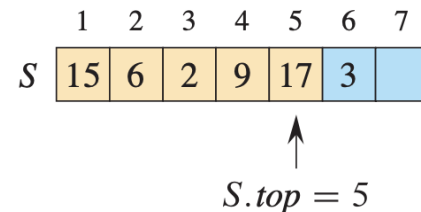
```
1 if STACK-EMPTY( $S$ )
2   error "underflow"
3 else  $S.top = S.top - 1$ 
4   return  $S[S.top + 1]$ 
```



(a)



(b)



(c)

- All stack operations take time  $O(1)$ .

## ► Stacks Application (1): Bracket Balance Checking

- $1 + \{2 * [x + (4y - z)] * [5x - (5y + z)] - 5t\}$
- `{[()][()]}`
- Are the brackets correctly balanced or not?
- Read the expression: **Push** each opening bracket and **pop** for each closing bracket
- If the type of popped bracket always matches return **true**, else return **false**
- What's the runtime of the algorithm?

## ► Stacks Application (2): Postfix expression

- $5 * ((9 + 3) * (4 * 2) + 7)$  (infix expression)
- $5\ 9\ 3\ +\ 4\ 2\ *\ * \ 7\ +\ *$  (postfix expression)
- Parsing postfix expressions is somewhat easier than infix expressions. Why?
- Read the tokens one at a time:
  - If it is an operand, **push** it on the stack
  - If it is a binary operator **pop** twice, apply the operator, and **push** the result back on the stack
- What is the runtime of the algorithm?

## ► Stacks Application (2): Postfix expression

- $5 * ((9 + 3) * (4 * 2) + 7)$  (infix expression)
- $5\ 9\ 3\ +\ 4\ 2\ *\ * \ 7\ +\ *$  (postfix expression)

Stack operations	Stack elements
◆ push(5)	5
◆ push(9)	5 9
◆ push(3)	5 9 3
◆ push(pop() + pop())	5 12
◆ push(4)	5 12 4
◆ push(2)	5 12 4 2
◆ push(pop() * pop())	5 12 8
◆ push(pop() * pop())	5 96
◆ push(7)	5 96 7
◆ push(pop() + pop())	5 103
◆ push(pop() * pop())	515

## ► Queues



head 

3	6	8
---	---	---

 tail

- The British love them 😊
- The first element in a queue is accessible.
  - First-in, first-out policy (FIFO)
- Insert is called **Enqueue**, Delete is called **Dequeue**.
- Queues have a **head** and a **tail**, like in a supermarket
  - Elements are added to the tail
  - Elements are extracted from the head

## ► Queues implemented using arrays

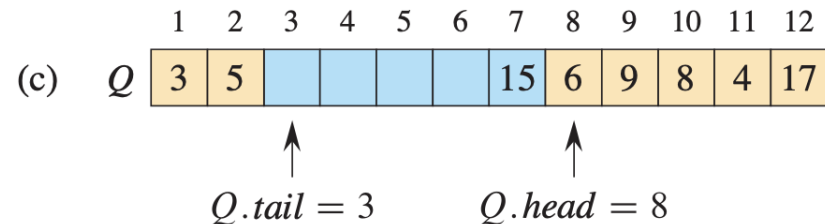
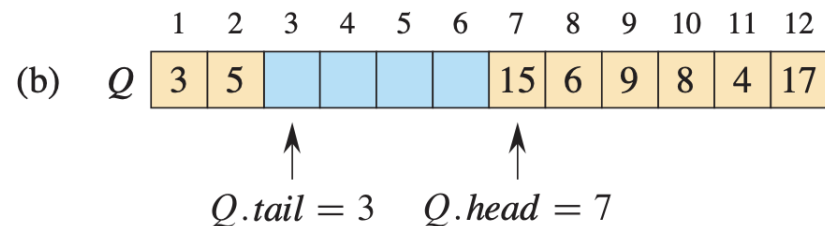
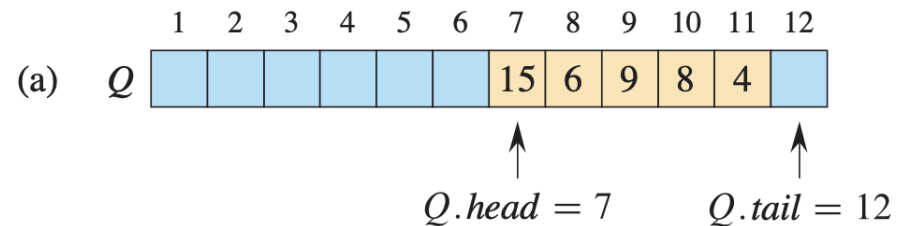
- Queues can be stored in an array “**wrapped around**”.

ENQUEUE( $Q, x$ )

```
1   $Q[Q.tail] = x$ 
2  if  $Q.tail == Q.size$ 
3       $Q.tail = 1$ 
4  else  $Q.tail = Q.tail + 1$ 
```

DEQUEUE( $Q$ )

```
1   $x = Q[Q.head]$ 
2  if  $Q.head == Q.size$ 
3       $Q.head = 1$ 
4  else  $Q.head = Q.head + 1$ 
5  return  $x$ 
```



- All queue operations take time  $O(1)$ .

## ► Queues: Applications

- Playlists (eg., iTunes)
- Dispensing requests on a shared resource (eg., a printer, a server, a processor etc.,)
- Data buffers (eg., streaming services)
- What if I have priorities on the use of the resource?

## ➤ Priority Queues: Motivation

- Schedule jobs on a computer shared among multiple users
- A max-priority queue keeps track of the jobs to be performed and their relative priorities
- When a job is finished the scheduler selects the job with highest priority from those pending
- Jobs can be added to the scheduler at any time

Job	Owner	Priority (key)
Job 1	Yao Xin	35
Job 12	Oliveto Pietro	2
Job 24	Hao Qi	22
Job 25	Yu Shiqi	18
Job 72	Yao Xin	30

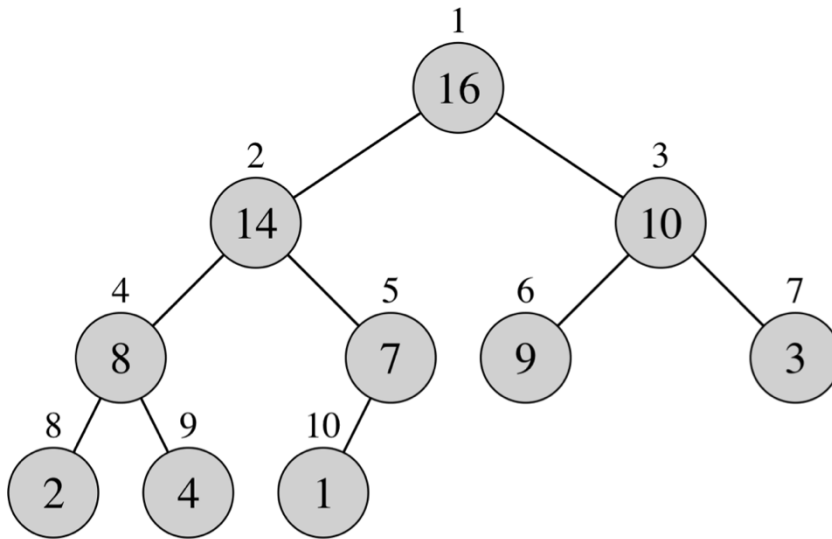
- **Use a heap!**



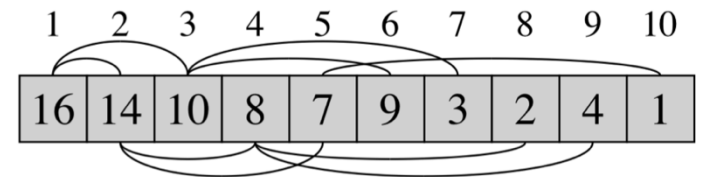
## ➤ Heap Properties

- **Max-heap property:** for every node other than the root, the parent is no smaller than the node,  $A[\mathbf{Parent}(i)] \geq A[i]$ .
- In a max-heap, the **root** always stores a **largest** element.

→ this is what we want!



(a)



(b)

- **Min-heap property:** for every node other than the root, the parent is no larger than the node,  $A[\mathbf{Parent}(i)] \leq A[i]$ .

## ➤ Priority Queue based on max-heap

- A data structure for maintaining a set  $S$  of elements with an associated element called key (the priority).

Operation	Time
Insert( $S, x, k$ ) – inserts $x$ with key $k$ into $S$	
Maximum ( $S$ ) – returns the element in $S$ with the largest key	
Extract-Max( $S$ ) – removes and returns element in $S$ with the largest key	
Increase-Key( $S, x, k$ ) – increases the key of $x$ to a larger value $k$ (element may float up in the heap)	

## ➤ Priority Queue based on max-heap

- A data structure for maintaining a set  $S$  of elements with an associated element called key (the priority).

Operation	Time
Insert( $S, x, k$ ) – inserts $x$ with key $k$ into $S$	$O(\log n)$
Maximum ( $S$ ) – returns the element in $S$ with the largest key	$O(1)$
Extract-Max( $S$ ) – removes and returns element in $S$ with the largest key	$O(\log n)$
Increase-Key( $S, x, k$ ) – increases the key of $x$ to a larger value $k$ (element may float up in the heap)	$O(\log n)$

Job  $x$ :     $x$ .satellite\_data;     $x$ .job\_address     $x$ .priority (key)

To increase priorities: we need a way to **map** the position of job  $x$  in the heap (and update it as it moves in the heap) to the position in our set of jobs )

**Min-priority queue** based on min-heap also exist: we will use them in graph algorithms (eg., Dijkstra, Prim)

## ➤ Find and extract next job

MAX-HEAP-MAXIMUM( $A$ )

```
1  if  $A.heap-size < 1$ 
2      error "heap underflow"
3  return  $A[1]$ 
```

MAX-HEAP-EXTRACT-MAX( $A$ )

```
1   $max = \text{MAX-HEAP-MAXIMUM}(A)$ 
2   $A[1] = A[A.heap-size]$ 
3   $A.heap-size = A.heap-size - 1$ 
4  MAX-HEAPIFY( $A, 1$ )
5  return  $max$ 
```

Job	Owner	Priority (key)	Handle	Handle after Build-Heap
1	Yao	35	1	1
12	Oliveto	2	2	5
24	Hao	22	3	3
25	Yu	18	4	4
72	Yao	30	5	2

1	2	3	4	5	
35	30	22	18	2	

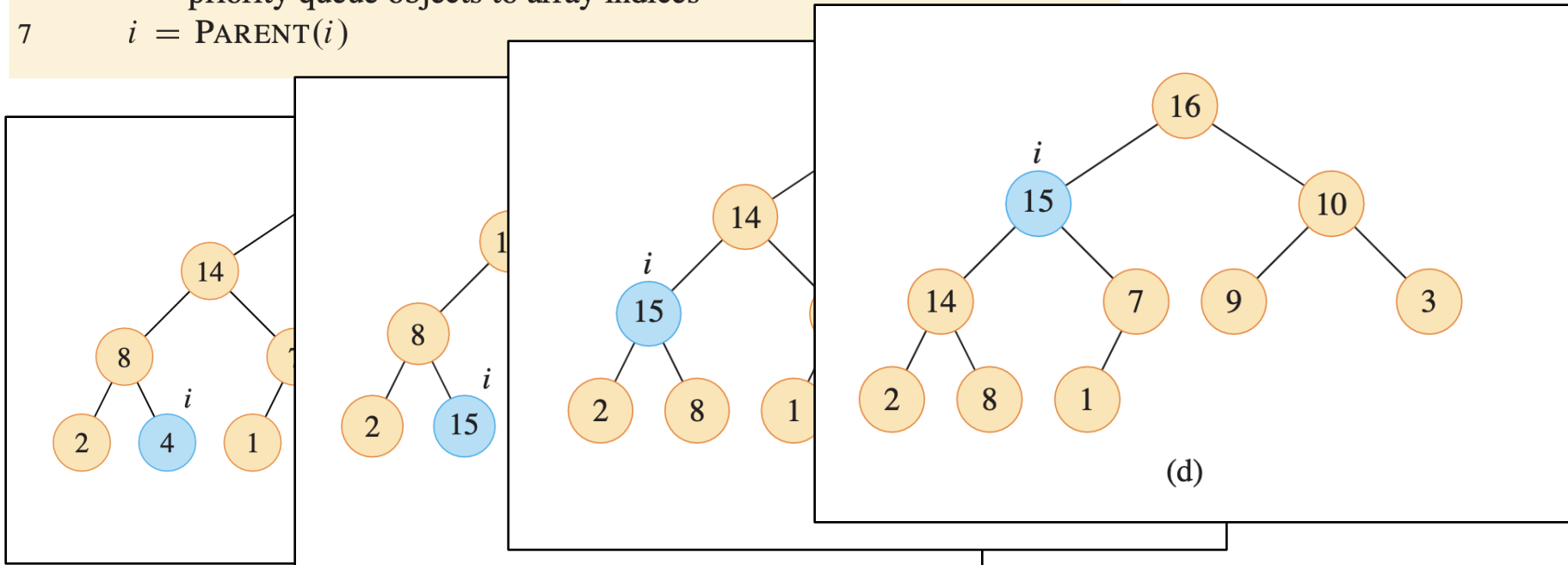
1	72	24	25	12
---	----	----	----	----

mapping

## ➤ Increase job priority

MAX-HEAP-INCREASE-KEY( $A, x, k$ )

```
1  if  $k < x.key$ 
2      error "new key is smaller than current key"
3   $x.key = k$ 
4  find the index  $i$  in array  $A$  where object  $x$  occurs
5  while  $i > 1$  and  $A[\text{PARENT}(i)].key < A[i].key$ 
6      exchange  $A[i]$  with  $A[\text{PARENT}(i)]$ , updating the information that maps
        priority queue objects to array indices
7   $i = \text{PARENT}(i)$ 
```



## ➤ Insert new job

```
MAX-HEAP-INSERT( $A, x, n$ )  
1  if  $A.heap-size == n$   
2      error “heap overflow”  
3   $A.heap-size = A.heap-size + 1$   
4   $k = x.key$   
5   $x.key = -\infty$   
6   $A[A.heap-size] = x$   
7  map  $x$  to index  $heap-size$  in the array  
8  MAX-HEAP-INCREASE-KEY( $A, x, k$ )
```

- Put the new object at the bottom of the heap (end of array)
- Save priority  $k$
- Set its priority to minimum ( $-\infty$ ) to preserve heap properties
- Call Max-Increase-Heap-Key ( $A, x, k$ )

## ► Linked Lists: Array Disadvantages

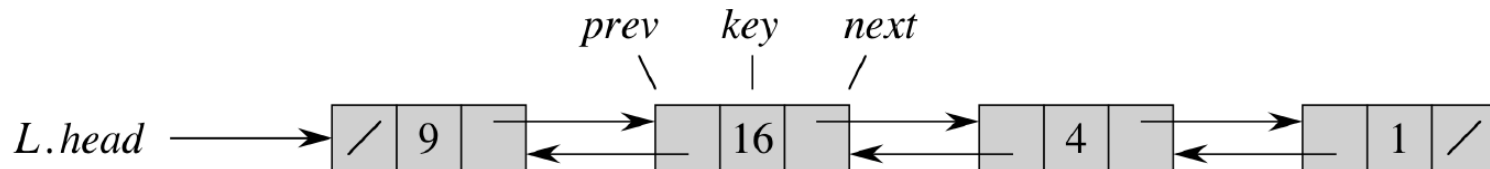
- You need to specify an initial size
- Changing the size of an array is troublesome
- Inserting and deleting elements in specific positions is difficult
- Let's say we want to delete 10 and keep the order of the rest:

<b>A</b>	5	8	10	13	16	19	27	46	51	86
<b>A</b>	5	8		13	16	19	27	46	51	86
<b>A</b>	5	8	13	16	19	27	46	51	86	

- What's the time complexity?

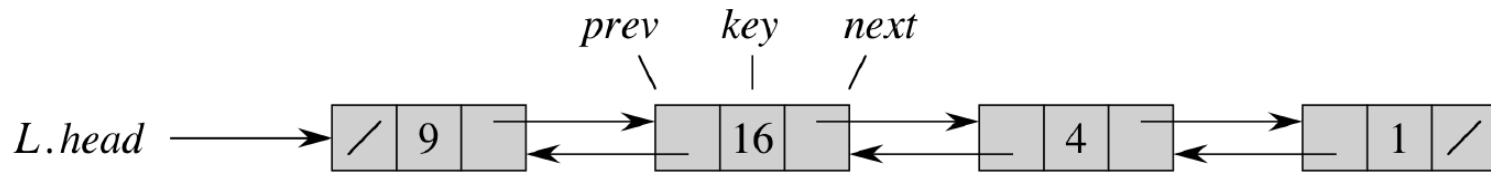
## ► Linked Lists

- Objects are linked using **pointers to the next element**.
- Linked lists can be **singly linked** or **doubly linked**: pointers to next and previous elements.
- Each element  $x$  has attributes
  - $x.key$  – the key used to identify the element
  - $x.next$  – a pointer to the next element
  - $x.prev$  – a pointer to the previous element
  - Optional: further satellite data





## ► Linked Lists: Searching



- Search inspects all elements in sequence and stops when the key has been found or the end of the list is reached.

---

LIST-SEARCH( $L, k$ )

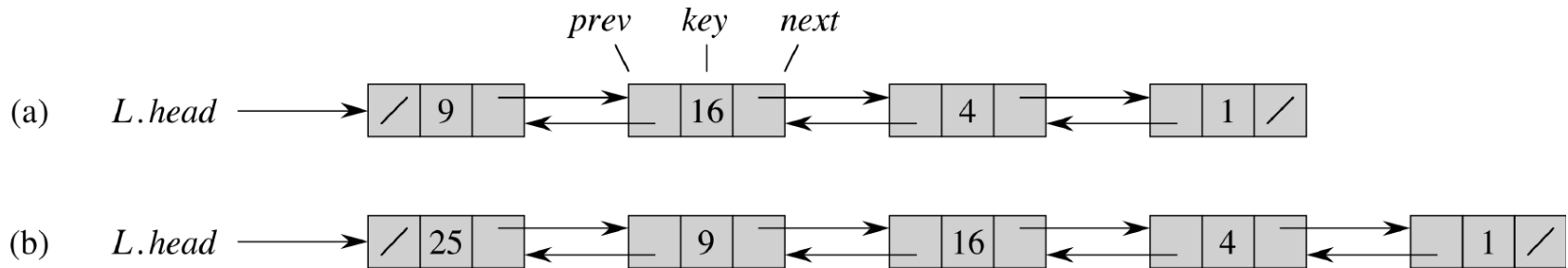
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```
1:  $x = L.head$ 
2: while  $x \neq \text{NIL}$  and  $x.key \neq k$  do
3:    $x = x.next$ 
4: return  $x$ 
```

---

- The worst-case time is  $\Theta(n)$ , since it may have to search the entire list.

## ► Linked Lists: Inserting at the front



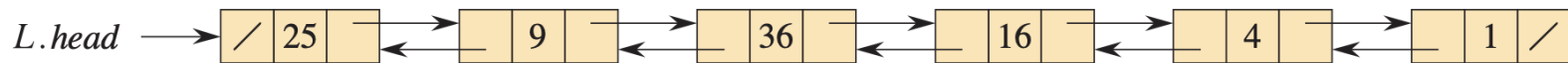
- New elements are added to the front of the list.

**LIST-PREPEND** ( $L, x$ )

```
1   $x.next = L.head$ 
2   $x.prev = NIL$ 
3  if  $L.head \neq NIL$ 
4       $L.head.prev = x$ 
5   $L.head = x$ 
```

- The time for an insertion is  $O(1)$ .

## ► Linked Lists: Inserting after element x



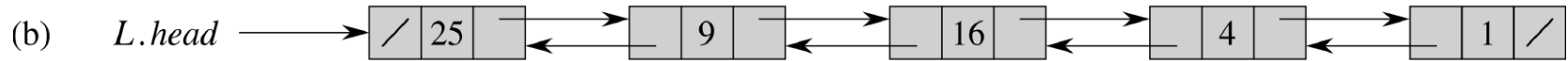
- New element added after element y.

LIST-INSERT( $x, y$ )

```
1   $x.next = y.next$ 
2   $x.prev = y$ 
3  if  $y.next \neq \text{NIL}$ 
4       $y.next.prev = x$ 
5   $y.next = x$ 
```

- The time for an insertion is  $O(1)$  if you know the pointer to y

## ► Linked Lists: Deleting



- If element  $x$  is known, update pointers to take it out.

---

LIST-DELETE( $L, x$ )

---

```

1: if  $x.prev \neq \text{NIL}$  then
2:    $x.prev.next = x.next$ 
3: else
4:    $L.head = x.next$ 
5: if  $x.next \neq \text{NIL}$  then
6:    $x.next.prev = x.prev$ 

```

---

- The time for a deletion is  $O(1)$ .  
But if we only have the key and need to search the element  $x$ , it's time  $\Theta(n)$  in the worst case.

## ► Summary

- **Stacks** and **Queues** are simple data structures that can
  - be implemented efficiently in arrays (modulo space issues)
  - Have a restricted set of operations, but these run in time  $O(1)$ .
- **Priority Queues**: all operations in at most  $O(\log n)$  time
- Linked lists form an **unordered list** of elements
  - **Insertion** is fast if not important where it occurs: time  $O(1)$ .
  - **Searching** takes worst-case time  $\Theta(n)$ .
  - **Deletion** runs in time  $O(1)$  if the element is known, otherwise we need to run a search beforehand and incur time  $\Theta(n)$ .