

# Data Structures and Algorithm Analysis (CSC317)

Intro/Review of Data Structures  
Focus on dynamic sets

We've been talking a lot about efficiency  
in computing and run time

.... But thus far mostly ignoring data  
structures

## Dynamic sets ...

- Set size changes over time
- Elements could have identifying keys, and could also have satellite data

**example:** key corresponding to friend name, with satellite data corresponding to email, phone, favorite hobbies, etc

Dynamic sets ... what operations?

# Dynamic sets ... what operations?

- Either **queries**
- Or **modifying operations** that change the set

# Dynamic sets ... what operations?

- Search
- Insert
- Delete
- Min / Max
- Successor / Predecessor

# Operations on dynamic sets...

## Which data structure?

- Depends on what you want to do.

We know of... ?

# Operations on dynamic sets...

## Which data structure?

- Depends on what you want to do.

We know of... hash table, stack, queue, linked list, tree, heap, etc.



# Data structures

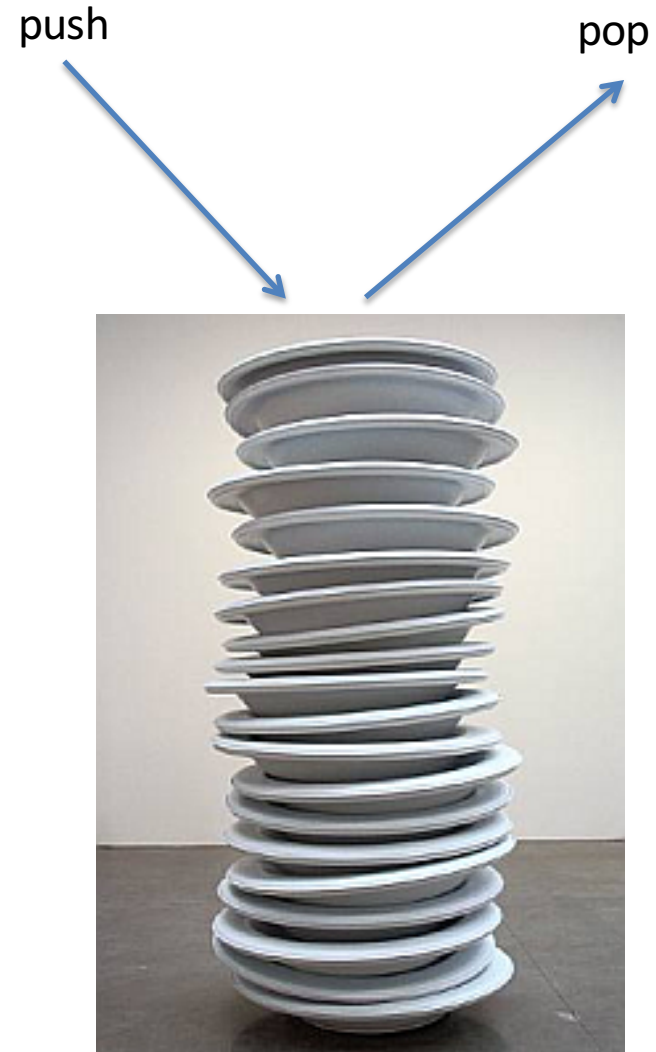
## Hash table

- Insert, Delete, Search/lookup
- We ***don't*** maintain order information
- Applications?
- We'll go through in detail later
- We'll see that all operations **on average  $O(1)$**

# Data structures

## Stack

- last-in-first-out
- Insert = push
- Delete = pop
- Applications?



# Data structures

## Stack

Run time of push and pop?  $O(1)$

Very fast!

But limited operations... (eg, if you want to Search it's not efficient)

# Data structures

## Queue

- first-in-first-out



# Data structures

## Queue

- first-in-first-out
- Insert = Enqueue
- Delete = Dequeue
- Applications?

# Data structures

## Queue

- first-in-first-out

Run time Enqueue/Dequeue:  $O(1)$

Very fast!

But limited operations...

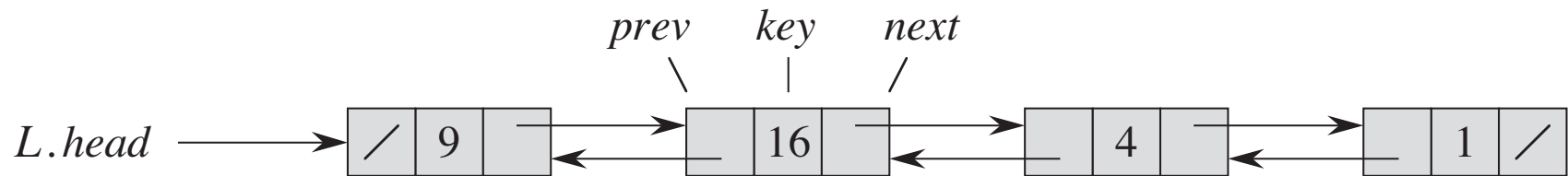
# Data structures

## Linked lists

- Search
- Insert
- Delete

# Data structures

## Linked lists (example of double linked)





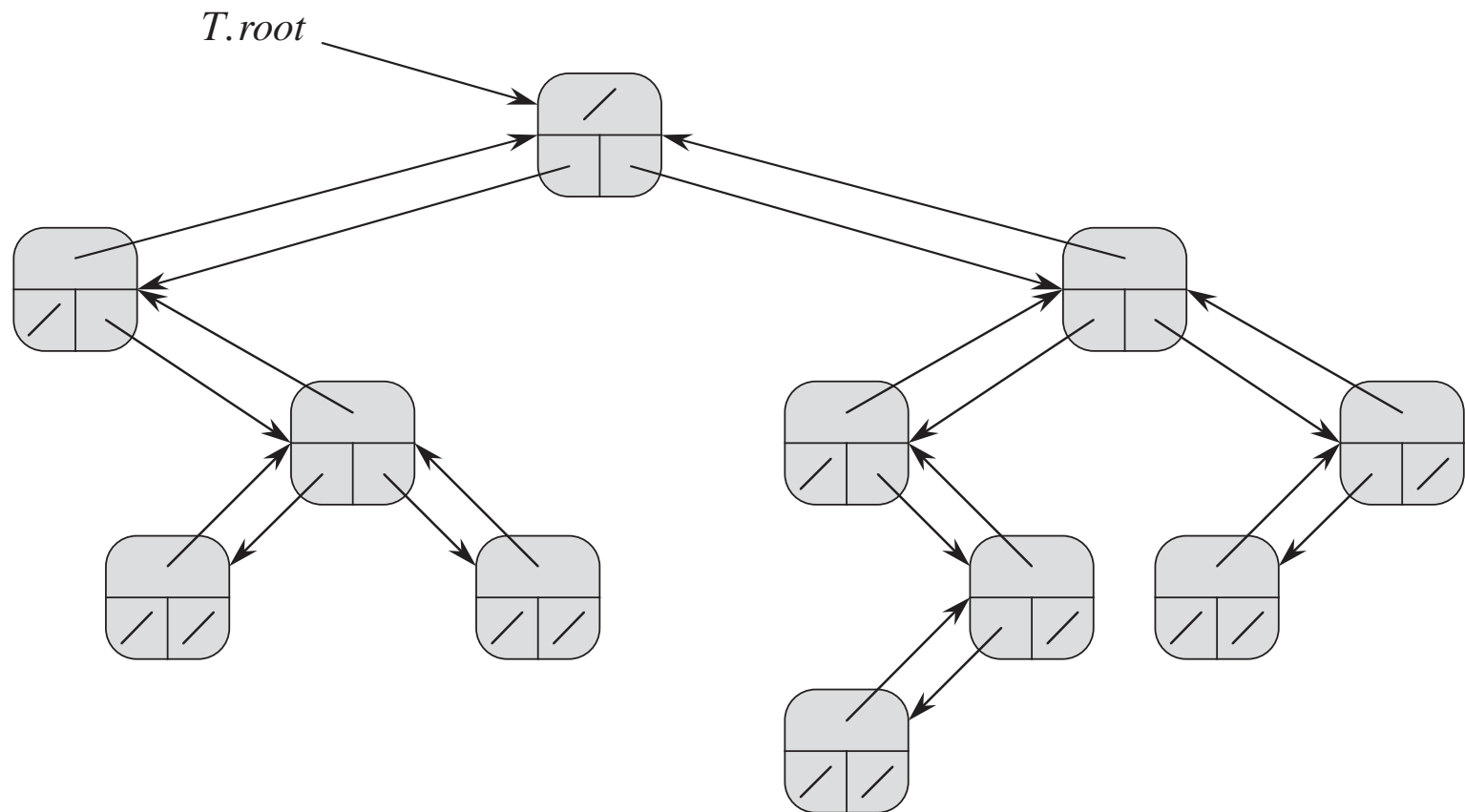
# Data structures

## Linked lists: Run time?

- Search  $O(n)$  [limitation if lots of searches]
- Insert  $O(1)$
- Delete  $O(1)$  [unless first searching for key]

# Data structures

## Binary tree and trees (later)



# Data structures

## Binary trees

- Search
- Min/Max
- Predecessor/Successor
- Insert/Delete
- Later; basic operations take height of tree, complete binary tree  $\Theta(\log n)$

# Data structures

Heap: main operations: (discussed in sorting chapter)

- insert  $\Theta(\log n)$
- Remove object from heap that is min (or max, *but not both*)  $\Theta(\log n)$
- Technically, can be implemented via a complete binary tree
- Applications?

# Data structures

Heap: main operations: (discussed in sorting chapter)

- insert  $\Theta(\log n)$
- Remove object from heap that is min (or max, but not both)  $\Theta(\log n)$
- Applications?
- (Heapsort) and we'll discuss finding median dynamically...

# Finding median dynamically

**Input:** numbers presented one by one:  $x_1, x_2, \dots, x_n$

**Output:** At each time step, the median

Run time?

# Finding median dynamically

**Input:** numbers presented one by one:  $x_1, x_2, \dots, x_n$

**Output:** At each time step, the median

**Run time?** We know we can do  $O(n)$  but dynamically each time we add a number, would like to do better and not have to recompute with  $O(n)$

# Finding median dynamically

**Input:** numbers presented one by one:  $x_1, x_2, \dots, x_n$

**Output:** At each time step, the median

- Using two heaps: one for max and one for min  
 $O(\log k)$  each step

On the board...



# Finding median dynamically

**Low Heap** holding smaller numbers: performs **max** operation in  $O(\log k)$  time

**High Heap** holding larger numbers: performs **min** operation in  $O(\log k)$  time

**Invariant:** half smallest number of elements so far in low heap; half highest in high heap

# Finding median dynamically

**Low Heap (max); High heap (min)**

**Invariant:** half smallest number of elements so far in low heap; half highest in high heap

- Consider if have 10 elements and inserting the 11<sup>th</sup>; 12<sup>th</sup> - need to maintain balanced number in each heap
- If Low has 6 elements and High 5 elements, and next element is less than max of Low, insert in low and move min of High to Low...

# Finding median dynamically

**Low Heap (max); High heap (min)**

**Computing median: each step  $\log(k)$  time**

- If  $k$  is odd number (eg, 6 in Low and 5 in High), extract min of High
- If  $k$  is odd number (eg, 5 in Low and 6 in High), extract max of Low
- If  $k$  even number, extract both min of High and max of Low