



Lecture 5: Data Structures II

COMP526: Efficient Algorithms

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Announcements

1. Second Quiz Open, due Friday

- Similar format to before
- Covers asymptotic (Big-O) notation
- Quiz is **closed resource**
 - No books, notes, internet, etc.
 - Do not discuss until after submission deadline (Friday night, after midnight)

2. CampusWire

- Use for discussion of material, questions about lectures, etc
- Public comments for matters related to module content & administration
- <https://campuswire.com/p/GBB00CD7A>, Code: 4796

3. Attendance Code:

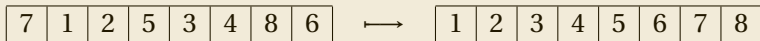
Meeting Goals

- Introduce Programming Assignment 1: Prefix Reversal Sorting
- Discuss the Queue ADT and implementations
- Introduce the Priority Queue ADT
- Introduce the heap data structure

Programming Assignment 1

Non-Standard Sorting

Fundamental Task: sorting a list of elements from smallest to largest



Typical basic (unit cost) operations:

- **compare** two elements to see which is larger
- **swap** two elements in the array

Non-standard sorting models:

- natural in contexts other than sorting arrays
- e.g., sorting physical objects with physical constraints
- compare and swap may not be elementary operations

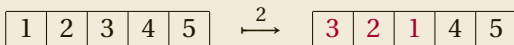


Credit: Andy Goldsworthy

Sorting with Prefix Reversals

Basic Operation: Prefix Reversal

- Reverse the elements up to index i in a list/array
- For example



- Natural operation for
 - DNA
 - stacks of physical objects

Basic Algorithmic Question: Given an array a of length n , what is the fewest number of **prefix reversal** operations necessary to sort a ?

Your Task

Input: an array (list) a of numbers between 1 and n .

Output: the array p of *prefix reversals* that when applied to a will result in a sorted array.

Goal: sort each array a using the fewest possible prefix reversals.

Example: Sort [4, 1, 3, 2]

PollEverywhere Question

Starting from the array
[4, 3, 5, 6, 1, 2]
what is the resulting array
after performing the
following prefix reversals?
[2, 5, 3]



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More Specifically

Array Structures for input

1. **random permutation** a is uniformly random shuffling of numbers from 1 to n
2. **tritonic** for $0 < a < b < n$ the values of a are *increasing* from indices 0 to a , *decreasing* from indices a to b , then *increasing* from indices b to $n - 1$.
3. **binary** a 's values are all 0 or 1
4. **ternary** a 's values are all 0, 1, or 2

For each structure you will define a function that generates a prefix reversal sequence that sorts arrays with the given structure.

Scoring:

- your program must correctly sort **all** arrays
- points for minimizing the number of prefix reversals over all challenge arrays

Suggestion: it is possible to sort any array of length n with fewer than $2n$ prefix reversals

- start by implementing a simple baseline procedure to sort all arrays

Queues

From Last Time

- Stack ADT
 - **linked list** implementation
 - **array** implementation
- Amortized analysis

The Queue ADT

Queues, Intuitively

Goal: to store a *collection* of elements

- elements arranged as in a queue at Tesco
- new people enter the **back** of the queue
- only the person at the **front** of the queue can be removed (serviced)

First In, First Out (FIFO) priority

Tons of Applications!

- Scheduling
- Messaging
- ...

Queues, Formally

- S is the state of the queue, initially $S = \emptyset$
- $S.ENQUEUE(x) : S \mapsto xS$
- $S.FRONT() : \text{returns } x_{n-1}$ where $S = x_0x_1 \cdots x_{n-1}$
- $S.DEQUEUE() : Sx \mapsto S$, returns x
- $S.EMPTY()$ returns $TRUE \iff S = \emptyset$

List Backed Queues

Idea

- Store each element in a NODE
- Store references to NODE:
 - head at the front of the queue
 - tail at the back of the queue

Issues:

- Similar to linked list stack implementation
 - Locality of reference
 - NODE memory overhead

```
1: class LISTQUEUE
2:   NODE head
3:   NODE tail
4:   procedure ENQUEUE(x)
5:     n ← new NODE
6:     n.data ← x
7:     tail.next ← n
8:     tail ← n
9:   end procedure
10:  procedure DEQUEUE
11:    n ← head
12:    head ← n.next
13:    return n.data
14:  end procedure
15: end class
```

Array Backed Queues

Idea:

- Store elements in the stack in an array
- Maintain indices of head and tail

What is the problem here?

- What happens if we repeatedly call
 - ENQUEUE(1)
 - DEQUEUE()
 - ENQUEUE(1)
 - DEQUEUE()
 - ...

Ignores resizing/checking if full

```
1: class ARRAYQUEUE
2:    $a \leftarrow$  new array, size  $n$ 
3:   head, tail  $\leftarrow$  0
4:   procedure ENQUEUE( $x$ )
5:      $a[\text{tail}] \leftarrow x$ 
6:     tail  $\leftarrow$  tail + 1
7:   end procedure
8:   procedure DEQUEUE
9:     head  $\leftarrow$  head + 1
10:    return  $a[\text{head} - 1]$ 
11:  end procedure
12: end class
```

Priority Queues

The (Min) Priority Queue ADT

Priority Queues, Intuitively

Goal: to store a *collection* of elements

- Each element x has an associated *priority*, $p(x)$
- New elements **inserted** with prescribed priorities
- Can access/remove element with the *minimum* priority in the collection

Applications

- efficient sorting
- implementing “greedy” algorithms
- resource management

Priority Queues, Formally

- S is the state of the queue, initially $S = \emptyset$
- $S.\text{INSERT}(x, p(x)) : S = x_0x_1 \cdots x_i x_{i+1} \cdots x_{n-1} \mapsto x_0x_1 \cdots x_i x x_{i+1} \cdots x_{n-1}$
 - where $p(x_i) \leq p(x) < p(x_{i+1})$
- $S.\text{MIN}() : \text{returns } x_0 \text{ where } S = x_0x_1 \cdots x_{n-1}$
- $S.\text{REMOVEMIN}() : xS \mapsto S, \text{ returns } x$

Naive Priority Queue Implementations

Array backed implementation

- Store element/priority pairs, sorted by priority
- MIN and REMOVE MIN can be implemented in $O(1)$ time
- INSERT is $\Theta(n)$ worst-case
 - must **shift** elements around x

Linked list backed implementation

- Store element/priority pairs, sorted by priority
- MIN and REMOVE MIN can be implemented in $O(1)$ time
- INSERT is $\Theta(n)$ worst-case
 - must **find** location to insert x

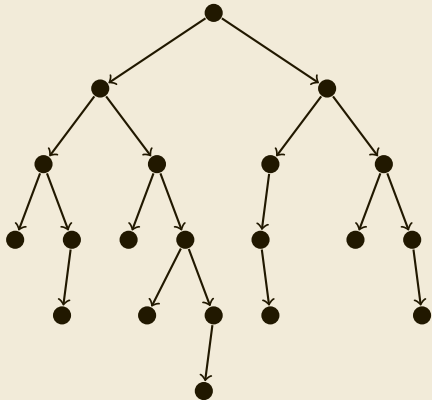
Question. Can we perform *all* operations in $o(n)$ time?

Heaps

Binary Trees

A (rooted) **binary tree** consists of

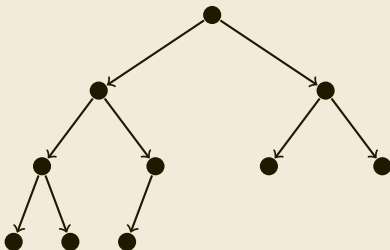
- A set V of vertices
- A distinguished vertex called the **root**
- Each vertex has (possibly empty):
 - left child
 - right child
- Non-root vertices have a parent
- All vertices are descendants of the root
- Vertices without children are **leaves**
- The **height** is the maximal distance from root to a leaf



Complete Binary Trees

A **complete binary tree** of height h is a binary tree in which:

- All vertices up to depth $h - 2$ have exactly two children
- At most one vertex at depth $h - 1$ has one child
 - if v has children, then vertices to the left of v have two children



Properties of Complete Binary Trees

Proposition

Suppose T is a complete binary tree of height h . Then the number n of vertices of T satisfies $2^h \leq n \leq 2^{h+1} - 1$.

PollEverywhere Question

If a complete binary tree T has n vertices, what is its height?

1. $h = \Theta(1)$
2. $h = \Theta(\log n)$
3. $h = \Theta(\sqrt{n})$
4. $h = \Theta(n)$



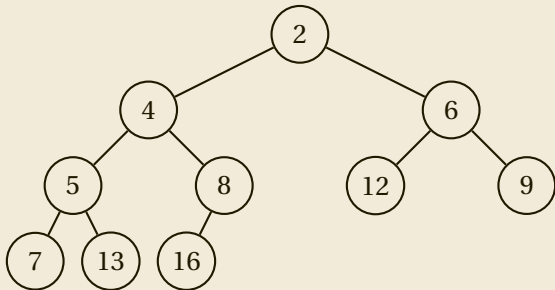
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Min Heaps

Definition

A **heap** is a complete binary tree T with the following properties:

- each vertex (node) has an associated value from an *ordered set*
 - for each pair of values p and q we can *compare* $p < q$
- the value associated with each vertex v is *smaller* than the values associated with its children



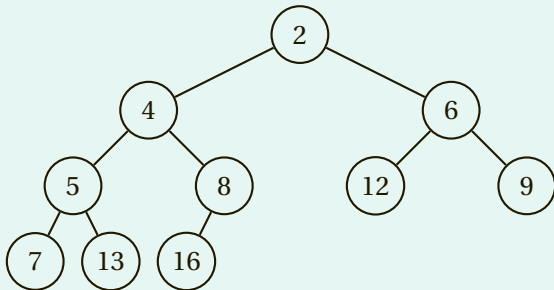
Inserting Into a Heap

Question

Given a heap T , how can we *efficiently* **insert a new a value** into T and maintain the heap properties?

Example

How to insert the value 3?



“Bubble Up” Insert Procedure

```
1: procedure INSERT( $p$ )
2:    $v \leftarrow$  new vertex storing  $p$ 
3:    $u \leftarrow$  first vtx with  $< 2$  children
4:   add  $v$  as  $u$ 's child
5:   PARENT( $v$ )  $\leftarrow u$ 
6:   while value( $v$ )  $<$  value( $u$ ) and  $u \neq \perp$  do
7:     SWAP(value( $v$ ), value( $u$ ))
8:      $v \leftarrow u$ 
9:      $u \leftarrow$  PARENT( $v$ )
10:  end while
11: end procedure
```

PollEverywhere Question

What is the running time of INSERT if T has n vertices?

1. $\Theta(1)$
2. $\Theta(n)$
3. $\Theta(\sqrt{n})$
4. $\Theta(n)$



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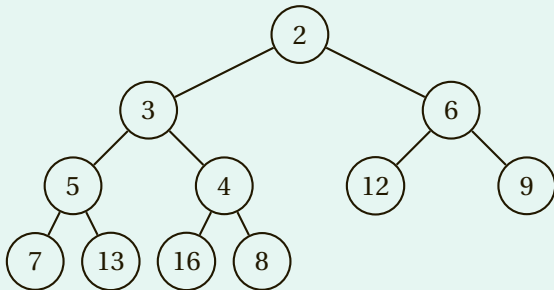
Removing Min

Question

Given a heap T , how can we *efficiently* **remove the minimum value** from T and maintain the heap properties?

Example

How to remove 2?



“Trickle Down” Remove Min Procedure

```
1: procedure REMOVEMIN
2:    $v \leftarrow$  tree root
3:    $w \leftarrow$  “last” vertex in tree
4:    $\text{value}(v) \leftarrow \text{value}(w)$ 
5:   remove  $w$  from tree
6:    $u \leftarrow$  smaller of  $v$ 's children
7:   while  $\text{value}(v) \geq \text{value}(u)$  and  $u \neq \perp$  do
8:     SWAP( $\text{value}(v)$ ,  $\text{value}(u)$ )
9:      $v \leftarrow u$ 
10:     $u \leftarrow v$ 's smaller child
11:  end while
12: end procedure
```

PollEverywhere Question

What is the running time of REMOVEMIN if T has n vertices?

1. $\Theta(1)$
2. $\Theta(\log n)$
3. $\Theta(\sqrt{n})$
4. $\Theta(n)$



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Heap Data Structures?

Question

What *elementary* data structures can we use to represent heaps?

- Our tree representation was somewhat vague...

Natural Choice: Tree of Nodes

- Have a NODE data structure where NODE stores:
 - data (value)
 - reference to PARENT
 - references to LEFTCHILD and RIGHTCHILD
- Similar drawbacks to linked lists: data overhead, locality of reference

Less Obvious Choice: Arrays!

- **For next time:** think about how you could represent a heap using an **array** and minimal additional overhead!

Heap Priority Queues

So far we heaps only store values from a ordered set

- A priority queue needs two data fields:
 1. a value x
 2. a priority $p(x)$
- The *priorities* are from an ordered set
- To implement a priority queue with a heap
 - each vertex v stores (refers to) x and $p(x)$
 - the value $\text{value}(v)$ is the priority $p(x)$

The payoff

- INSERT in time $\Theta(\log n)$
- REMOVEMIN in time $\Theta(\log n)$
- MIN in time $\Theta(1)$

Next Time: More Trees!

- Searching Sorted Arrays
- Binary Search Trees
- Balanced Binary Trees

Scratch Notes
