

Way of solving a problem

time, space, energy

Document distance

How to review

- Class notes ← started

- Final notes

- Textbook ← prob best

Input + Output

Correct = halts w/ correct output

Dual purpose of review

Google

6.006

Data structure

②

# Insertion Sort

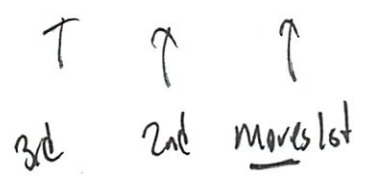
Start w/ empty left hand  
+ cards face down

remove one card at a time  
+ insert in proper position

Officially in place

- just swaps order
- but can also push over

remember what sudo code is saying



← so alg goes that way  
fill if works

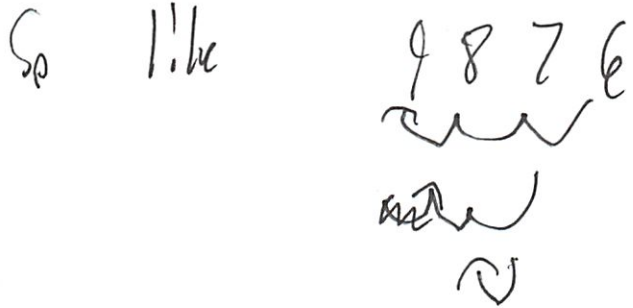
\*Really understand what is going on\*

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Worst Case running time

Look at each step

$\Theta(n^2)$  since for each # each could be moved

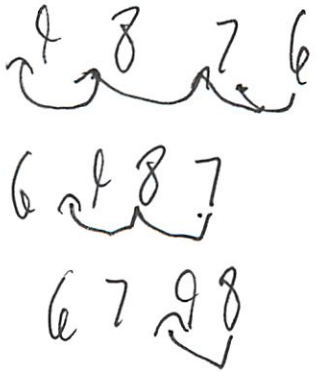


So log n

No for some reason  $n^2$

Since the first one is n at worst

Qm:



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I did it wrong

9 8 7 6 1

8 9 7 6 2

7 8 9 6 3

6 7 8 9

← This is  $n$

$\ln$  is split in 2 each time - which it is not

∴ So I guess  $n^2$

Grows quadratically

So input <sup>size</sup> 4 worst case is  $3+2+1=6$

5

$4+3+2+1=10$

6

$5+10=15$

∴ but that is growing at  $n$

5

Yeah  $n$  would grow at  $n^2$   $n$  each new step  
 ? correct ?

$4^2 = 16$   $5^2 = 25$  ? doesn't match

Divide + Conquer

Divide

Conquer

Combine

but  $\frac{n}{2}, n$  is still  $n^2$   
 (and!)

ie Merge sort

splits up all the way  
 then combines  
 in reverse

$$T(n) = \begin{cases} \Theta(1) & n=1 \\ 2T(n/2) + \Theta(n) & n > 1 \end{cases}$$

So  $\ln(n)$  # of levels each costing  $Cn$   
 So  $\Theta(n \lg n)$

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$$\Theta(g(n)) = 0 \leq c_1 g(n) \leq f(n) \leq c_2 g(n)$$

for  $n \geq n_0$

So middle  
-asy tight

$O(g(n))$  = asy upper bound

$\Omega$  = asy lower bound

$O$  = upper

$\omega$  = lower

---

of course

$$a^0 = 1$$

$$a^1 = a$$

$$a^{-1} = 1/a$$

$$(a^m)^n = a^{m \cdot n} = (a^n)^m$$

$$a^m a^n = a^{m+n}$$

at least I know that now

①

## Master Theorem

$$T(n) = aT(n/b) + f(n)$$

1.  $f(n) = O(n^{\lg_b a - \epsilon})$

then  $T(n) = \Theta(n^{\lg_b a})$

2.  $f(n) = \Theta(n^{\lg_b a}) \rightarrow T(n) = \Theta(n^{\lg_b a} \lg n)$

3.  $\Omega(n^{\lg_b a + \epsilon})$  and  $af(\frac{n}{b}) \leq cf(n)$

$$T(n) = \Theta(f(n))$$

What was the easy version

1.  $9T(n/3) + n$

$$n^{\lg_3 9} = n^2 \quad \text{so } \epsilon = 1 \quad \text{so } T(n) = \Theta(n^2)$$

---

$$\lg_2 16 = 4$$

$$4^2 = 16$$

what is this



2.  $T(n) = 3 T(n/4) + n \lg n$

$n \lg_4 3 = \Theta(n^{.793})$   
So case 3

$$3 \left(\frac{n}{4}\right) \lg\left(\frac{n}{4}\right) \leq \left(\frac{3}{4}\right) n \lg n = c f(n)$$

$c = \frac{3}{4}$

So  $\Theta(n \lg n)$

3.  $T(n) = 2 T(n+2) + n \lg n$

$$n \lg_2 2 = n$$

$n$  is not polynomially larger

∴ don't get what is happening

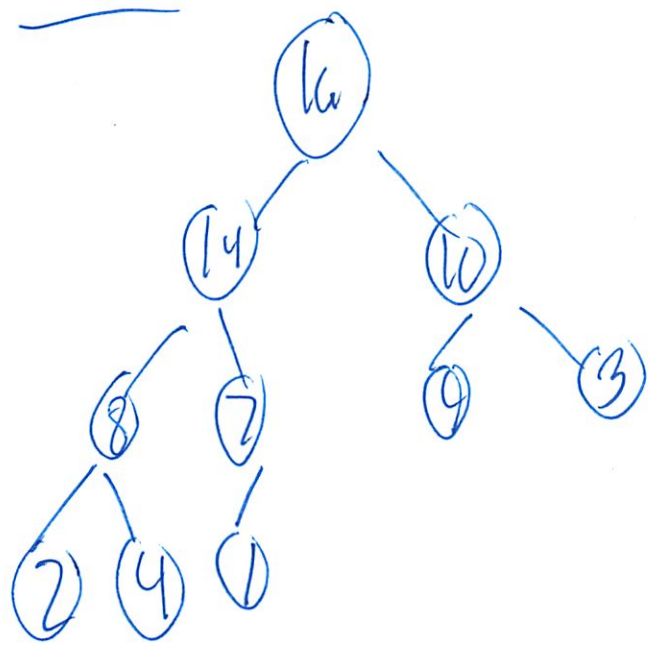
Need to find the simple version

↳ Do later



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# Heaps



Parent (i)

return  $\lfloor i/2 \rfloor$

left (i) return  $2i$

right (i) return  $2i + 1$

min or max heap

$$A[\text{Parent}(i)] \leq A[i]$$

Parent  $\lfloor i/2 \rfloor$  must be less

$$A[\text{Parent}(i)] \geq A[i]$$

parent  $\lfloor i/2 \rfloor$  must be greater

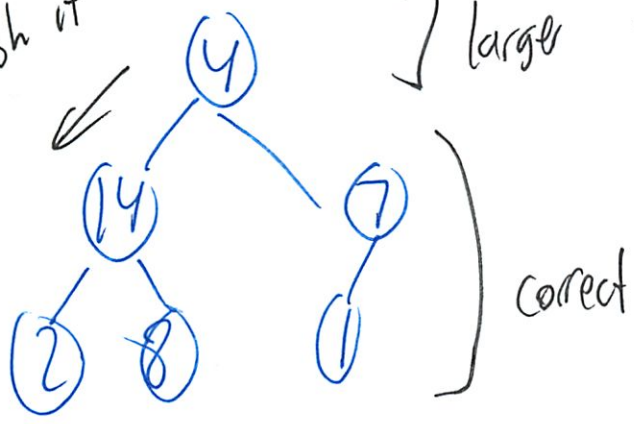
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Max Heaps  
Need to maintain property

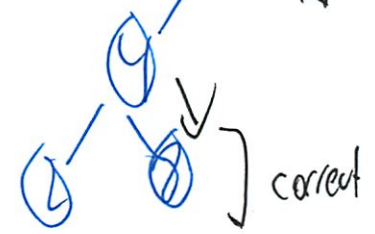
assumes  $left(i)$   $right(i)$  is correct  
but  $A[i]$  might be smaller than children

Push it down  
] larger than its children

then  
max  
heapify  
that



] parent



$$T(h) = O(\log n)$$

$$= O(h)$$

since  $h$  is  $\log n$

## ⑩ Build max heap

build from bottom up

run max heapify on each

from  $A \left[ \left( \lfloor n/2 \rfloor + 1 \right) \dots n \right]$

run the bottom level

## Heap sort

builds max heap  $A[1 \dots n]$

So  $O(n \lg n)$

Quicksort usually beats though

## Priority queue

data structure

insert()

max() — in  $O(1)$

extract max()

increase key()

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extract - returns max  
and then compares it  
and then max heapifies

increase key  
exchanges w/ parent

heap insert  
calls heap increase key

## Quick sort

Often the best practical choice  $\Theta(n \log n)$   
though worst case  $\Theta(n^2)$

quick sort half after partitioning

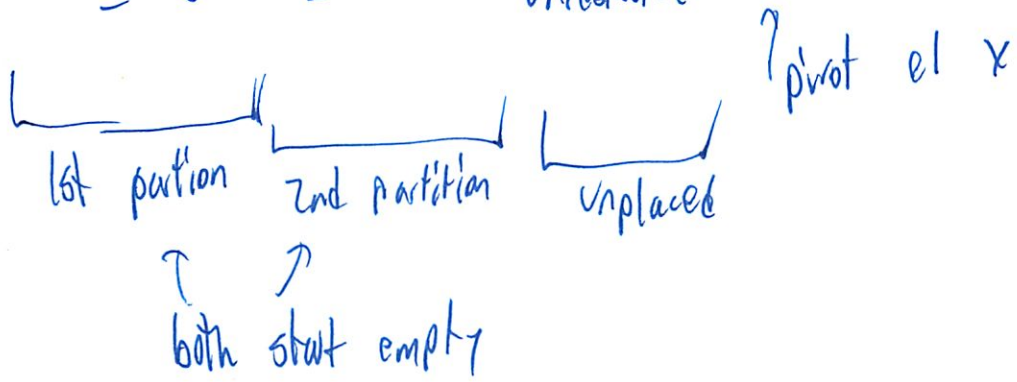
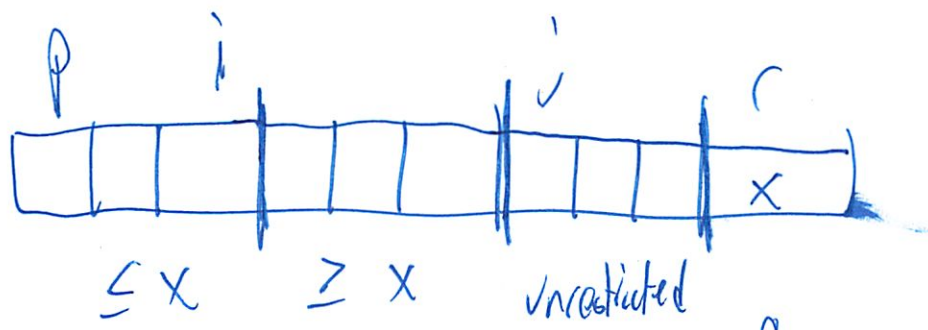


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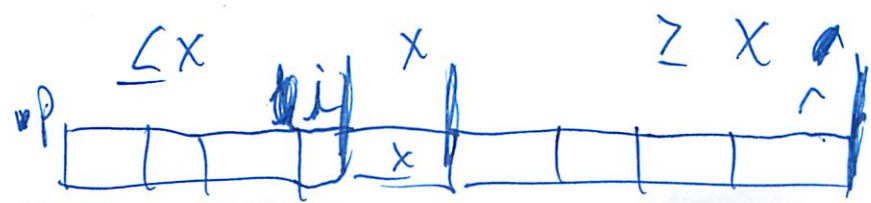
partitioning selects an element  $x = A[r]$  as a pivot  
partitions into 4 (empty) regions

1. If  $p \leq h \leq i$  then  $A[h] \leq x$
2. If  $i+1 \leq k \leq j-1$  then  $A[k] \geq x$
3. If  $k = r$  then  $A[k] = x$

did we ever learn this?



ends w/



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base behind the scenes

1. if  $A[j] > x \rightarrow$  increment  $j$
2. if  $A[j] \leq x \rightarrow$  increment  $i$   
     Swap  $A[i]$  and  $A[j]$   
     increment  $j$

Worst case (I think I get it now!)

Randomized

— pick  $A[r]$  at random



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## Linear time sorting

Others were not linear

Since decision tree

## Counting sort

The # in each bin

## Radix sort

From old machines

Least - sig digit (st!)

## Bucket sort

Sorts stuff into buckets

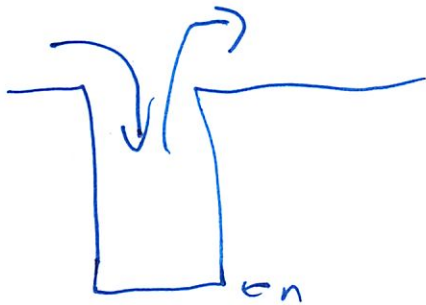
Pointers within buckets



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dynamic sets = can add + subtract

Stacks push + delete



Underflow = pop empty stack

$S_{top} > n = \underline{\text{overflow}}$

Queue

enqueue()                      dequeue()



Linked list



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# Binary trees

parent	
value	
left	right

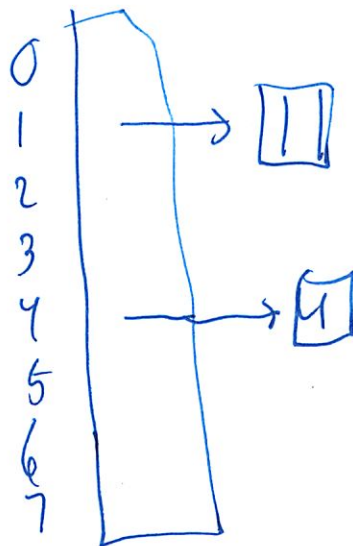
# Hash tables

insert

Search =  $O(1)$

delete

most basic → direct address

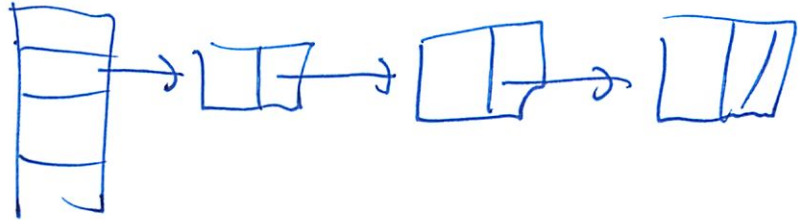


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Or use a hash function

- division
- multiplication
- universal - choose fn randomly

Can chain



but this runs the worst case

Open addressing keep going till find something

Binary search tree



left:  $y.key \leq x.key$

right:  $y.key \geq x.key$

of x

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## In-Order tree walk()

(what I f-ed up last time at Google)

In-order tree walk (x, left)

print x.key

I.O T W (x, right)

Search(x, k)

↳ search x for k

if = return

go left

if  $k < x.key$

go left

else

go right

min()

go all the way left

max()

" " " " right

# Insert

(this is the complicated one)  
I should I know: ↳ no delete is

Takes node z for which  $z.key = v$   
 $z.left = nil$   
 $z.right = nil$  / duh

Looks in tree  
going left or right

Delete  
I always will be a left I think  
↳ did I ever realize that before?  
this one is complex

if no children - just delete

if 1 child - replace it

if 2 children - find z's successor y  
↳ in z's right subtree

have y takes z's place  
rest of z's original right subtree is y's new right tree

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z's left subtree because y's was left subtree

### Height

random  $h = \lg n$

worst case  $h = n$

### Red Black

what did we do in class?

Balanced tree

Like when you add - be extra careful to keep it balanced

AVL = height balanced

left + right differ by at least 1

balance w/ rotations

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### Augmented structures

Can add extra info

must keep it up to date though



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like interval trees

study

6.006 did cover - but in a diff way

Can have both endpoints (closed)  
or just 1 (Open)

good for time

Rod cutting

Another I didn't use book for

Memorization

Ah Dynamic Programming - Using previous results

- Smaller subproblems

- Combine answers to those

Can do bottom up - solve pieces + combine

top down - split up into little pieces + solve



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Skipping other examples

- even though don't really know
- review it later

Greedy - picking up a lot

- trying to take as much as possible up front
- making the globally optimal sol from locally optimal options

knapsack proof

(why didn't I use the book?)

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Amortized Analysis

average the time it takes to perform the action over all operations performed  
guarantees avg performance in the worst case

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In class this was making the array bigger/smaller

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## B-trees

Balanced search trees designed to work on disks  
Like red-black trees but minimize I/O

But can have many children

↳ branching factors

but each node has  $O(\lg n)$

$x_{i,n}$  keys  $\rightarrow x_{i,n} + 1$  children

Make a  $(x_{i,n} + 1)$ -way decision

height grows  $\lg$

Optimized for disk <sup>- want some pg</sup>  
than in depth should I review?

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disk-read()

disk-write()

node is  $\sim 1$  pg large

branching factor  $\sim 50 - 2000$

Wider = less disk accesses

So each node has pointers to its children

But how does it know where to go?

Like in BST normally in order

Oh  $k_1 \leq x, key_1 \leq k_2 \leq x, key_2 \dots$

---

height

$$h \leq \lg_t \frac{n+1}{2}$$

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Search

Start at root

Returns  $(y, i)$  such that  $y.key_i = k$

Skipping rest

Merging heaps

Fib heaps

Data structure made of trees

find min  $O(1)$

Others in constant amortized time

unlike binomial trees

which is like binary trees

↳ 'our normal trees'?

I think we talked about these - but  
not in detail. --

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## Graphs

Sparse vs dense

representations

adj - list

adj - matrix

Some weighted / Some not

## BFS

I should really have this down!

It looks at all neighbors

Adds to the start end

Investigates the next one

This one officially does the color thing

White = undiscovered

Gray = queued

Black = explored



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Finds the shortest ~~path~~ path distance

BF Trees

Builds a predecessor sub graph

### Depth First

Go deep

Then back track

Discovered + Finished time stamps

Insert to stack

Forms parent/child structure

Edge Types

Tree

Back

Forward

Cross - all other

### Topo sort

DFS by finishing time

~~most~~ last finished first

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Strongly Connected Components

Single Source shortest path

~~All pairs~~ - when neg  
Bellman Ford

- can be neg  
 $O(VE)$  relax edges

Dijkstra  
Faster  
but must be all  $\oplus$   
min queue w/  
fib heap

DAG shortest path

All Pairs  
Floyd - Warshall can be neg

$O(V^3)$   
finds all possible paths

Johnson  
for sparse