

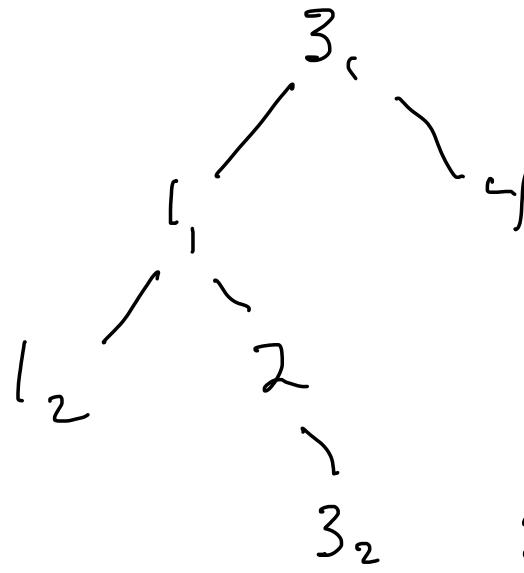
# Data structures

## Packet 3

3<sub>1</sub> 1<sub>1</sub> 4 1<sub>2</sub> 5<sub>1</sub> 9 2 6 5<sub>2</sub> 3<sub>2</sub>

binary tree

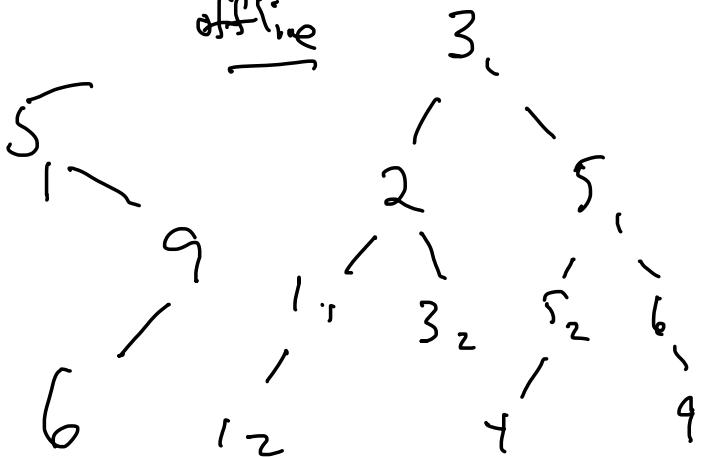
online



Symmetric (inorder)

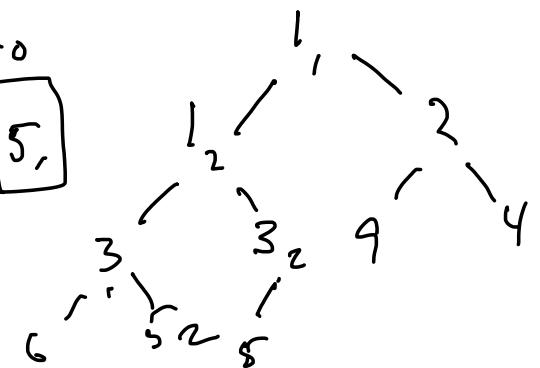
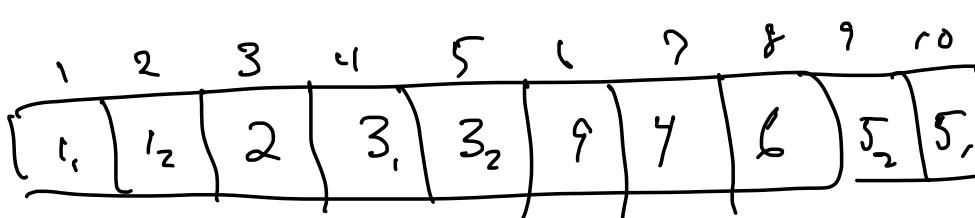
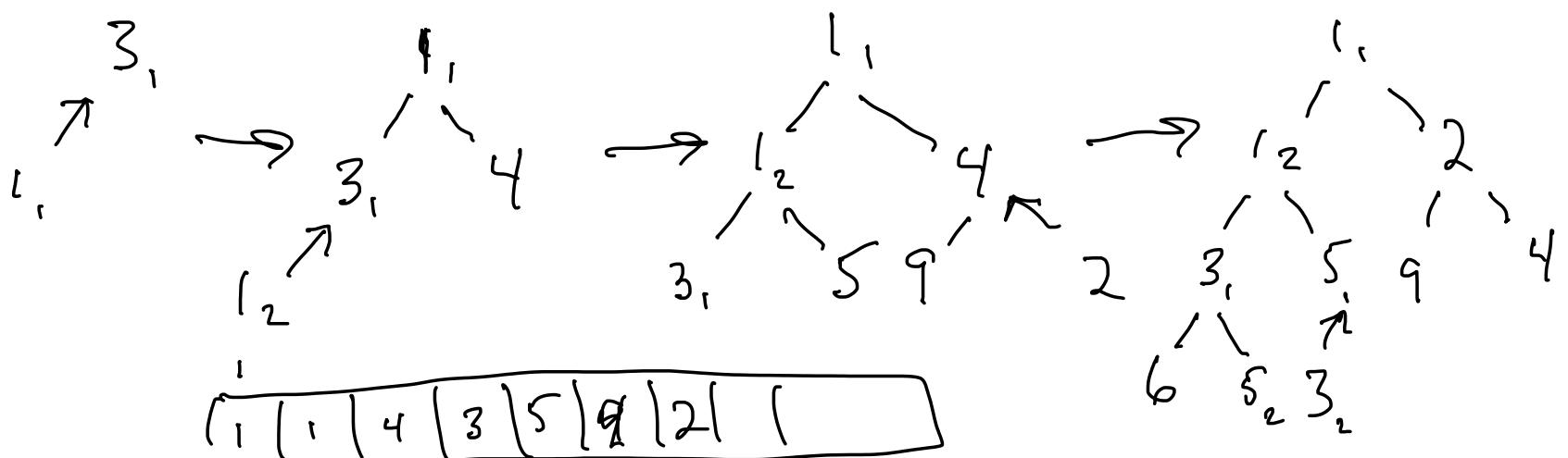
1<sub>2</sub> 1<sub>1</sub> 2 3<sub>2</sub> 3<sub>1</sub> 4 5<sub>2</sub> 5<sub>1</sub> 6 9

offline



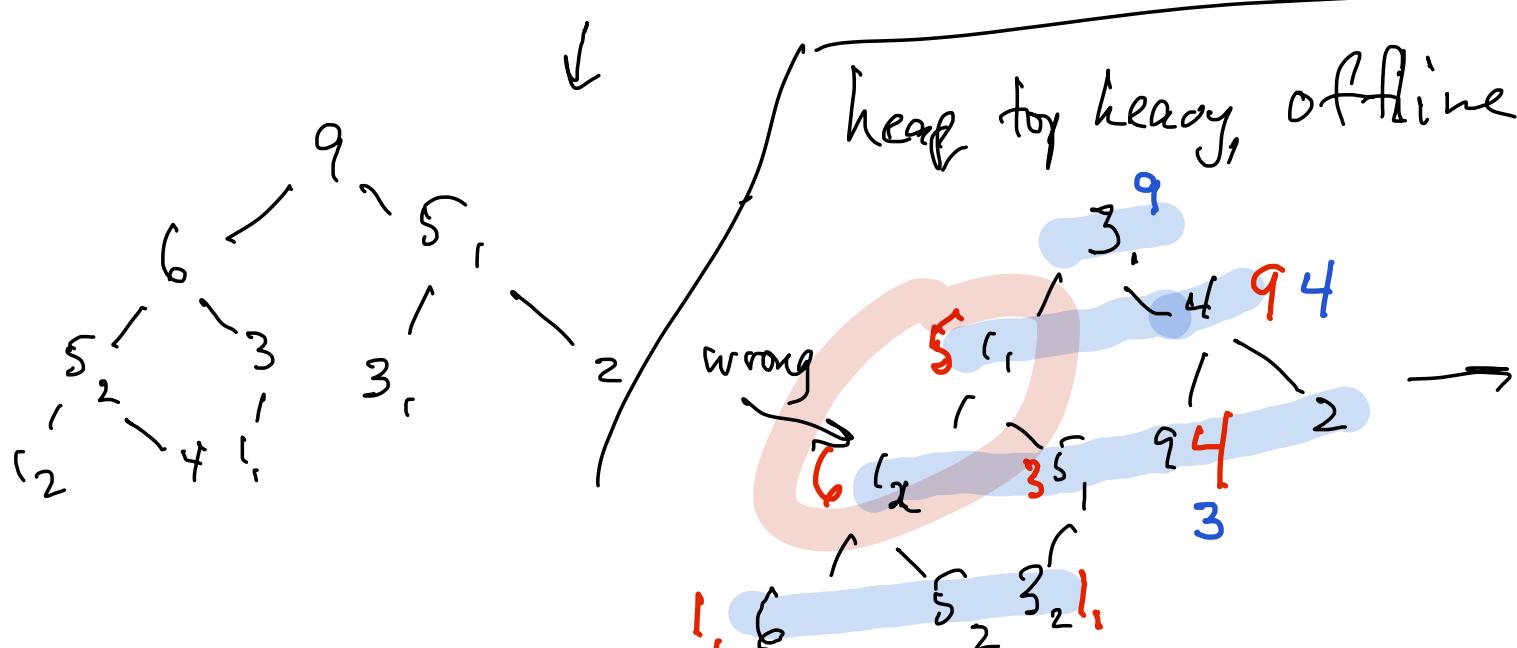
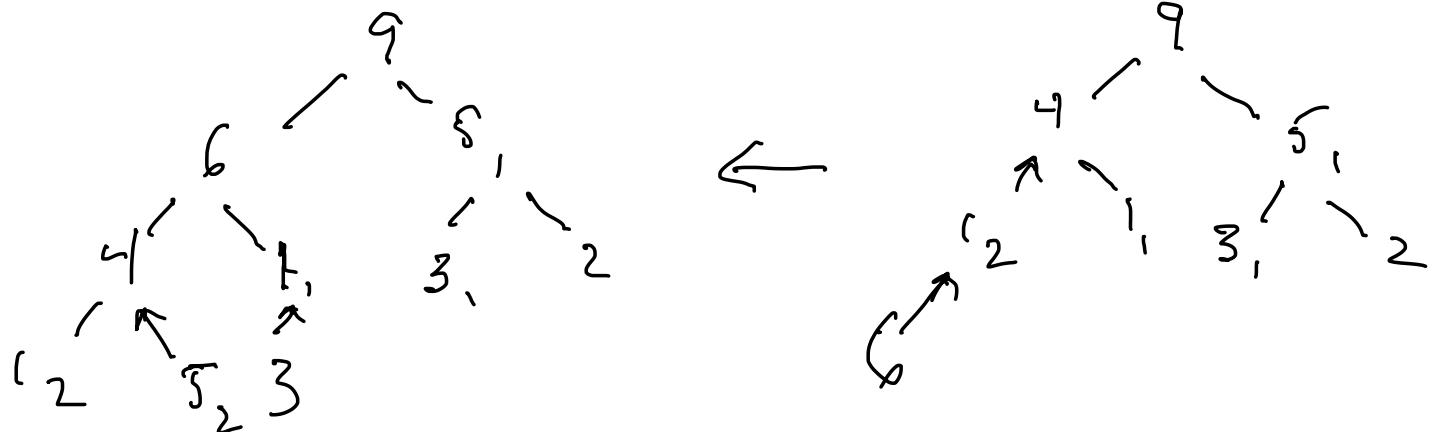
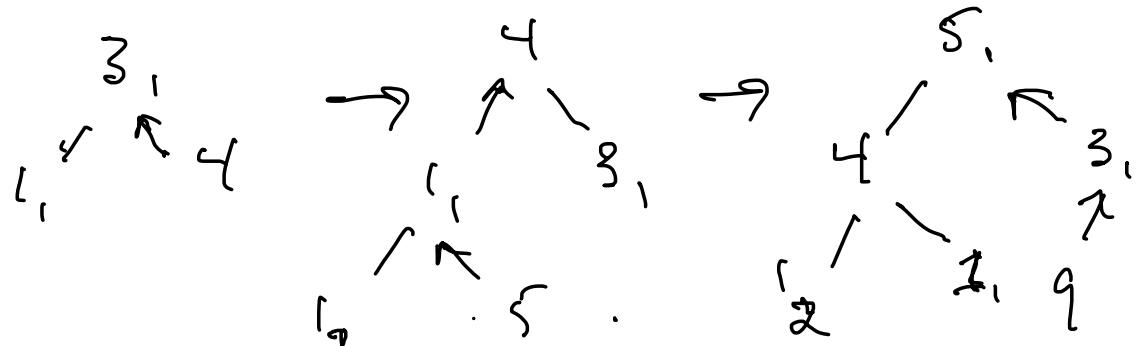
heap (top light)

3<sub>1</sub> 1<sub>1</sub> 4 1<sub>2</sub> 5<sub>1</sub> 9 2 6 5<sub>2</sub> 3<sub>2</sub>

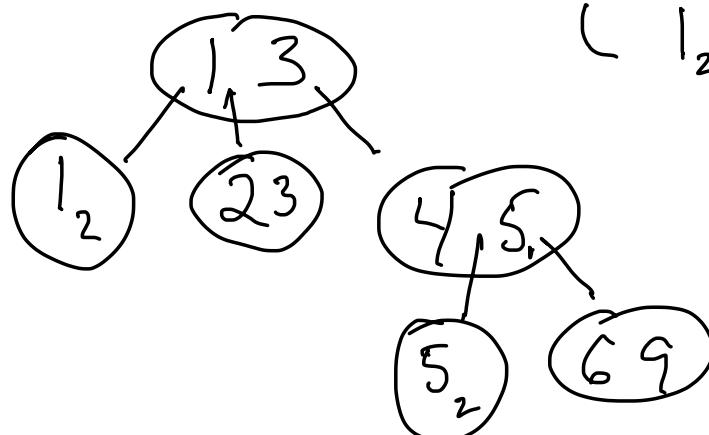


3<sub>1</sub> 1<sub>1</sub> 4 1<sub>2</sub> 5<sub>1</sub> 9 2 6 5<sub>2</sub> 3<sub>2</sub>

heap (top - heavy)  
online

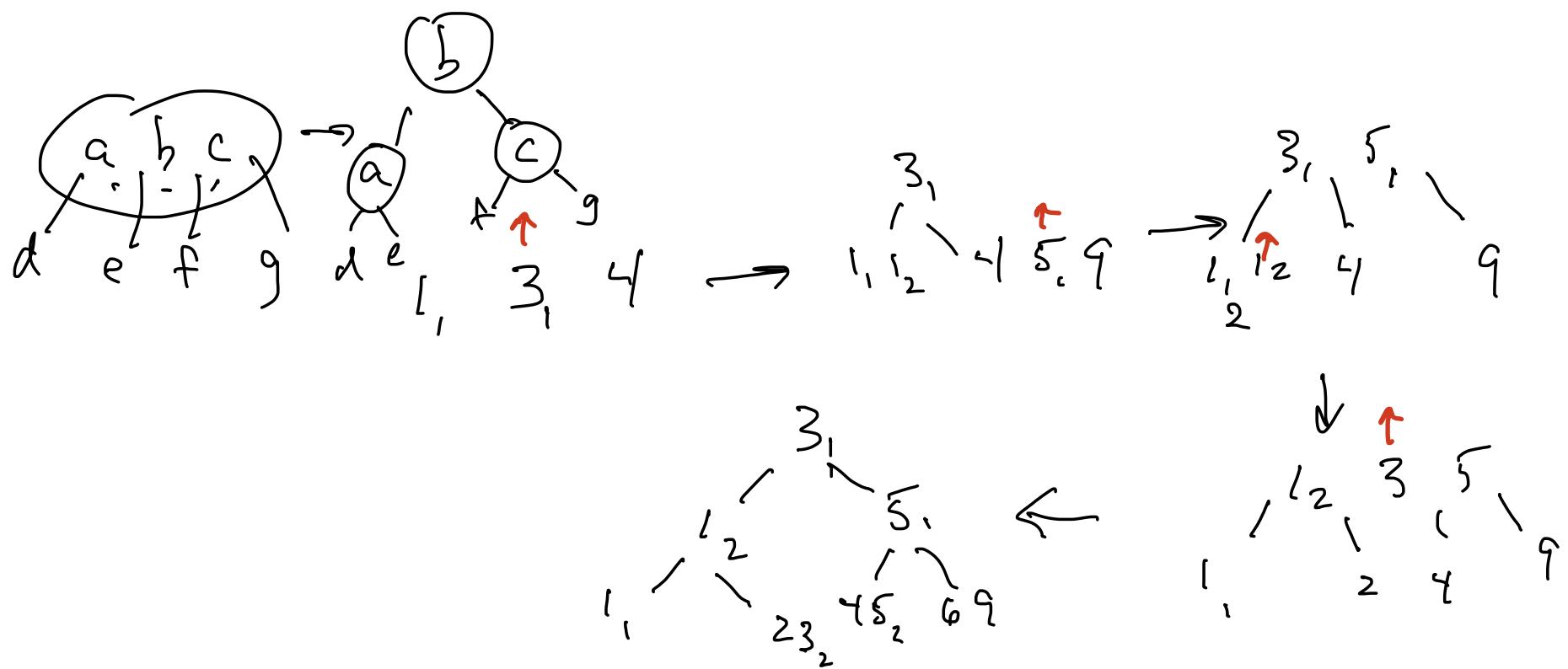


ternary free (online) 3<sub>1</sub> 1<sub>1</sub> 4 1<sub>2</sub> 5<sub>1</sub> 9 2 6 5<sub>2</sub> 3<sub>2</sub>



( 1<sub>2</sub> ) ; ( 2 3 ) ; 3( 4 5 ) 5( 6 9 )

2-3 tree (online)  $3_1, 1_1, 4, 1_2, 5_1, 9, 2, 6, 5_2, 3_2$



pre-order traversal:

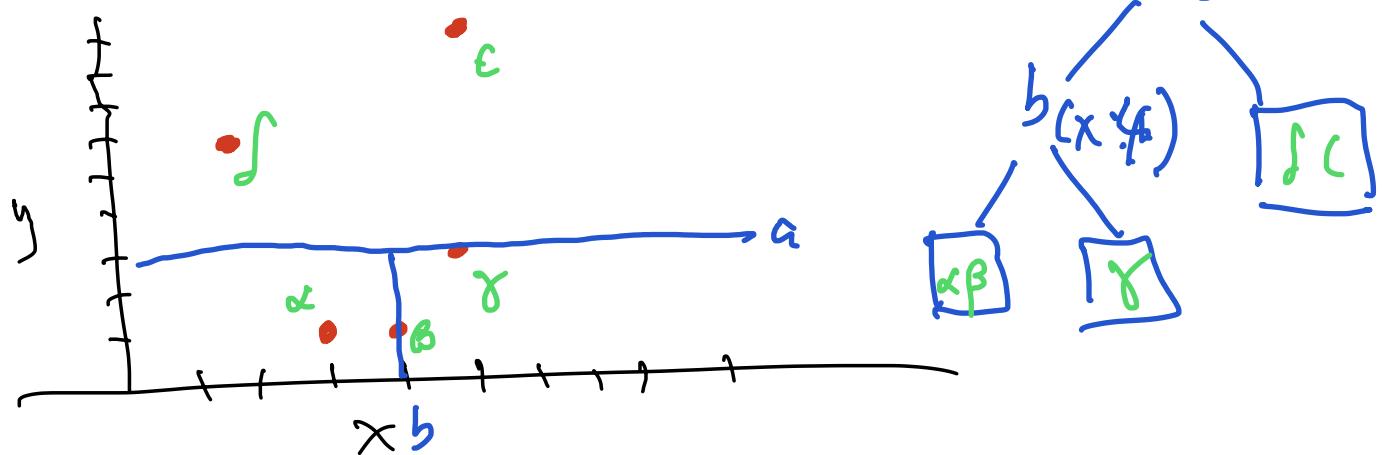
$3_1, 1_2, 1_1, 2, 3_2, 5_1, 4, 5_2, 6, 9$

post-order traversal:

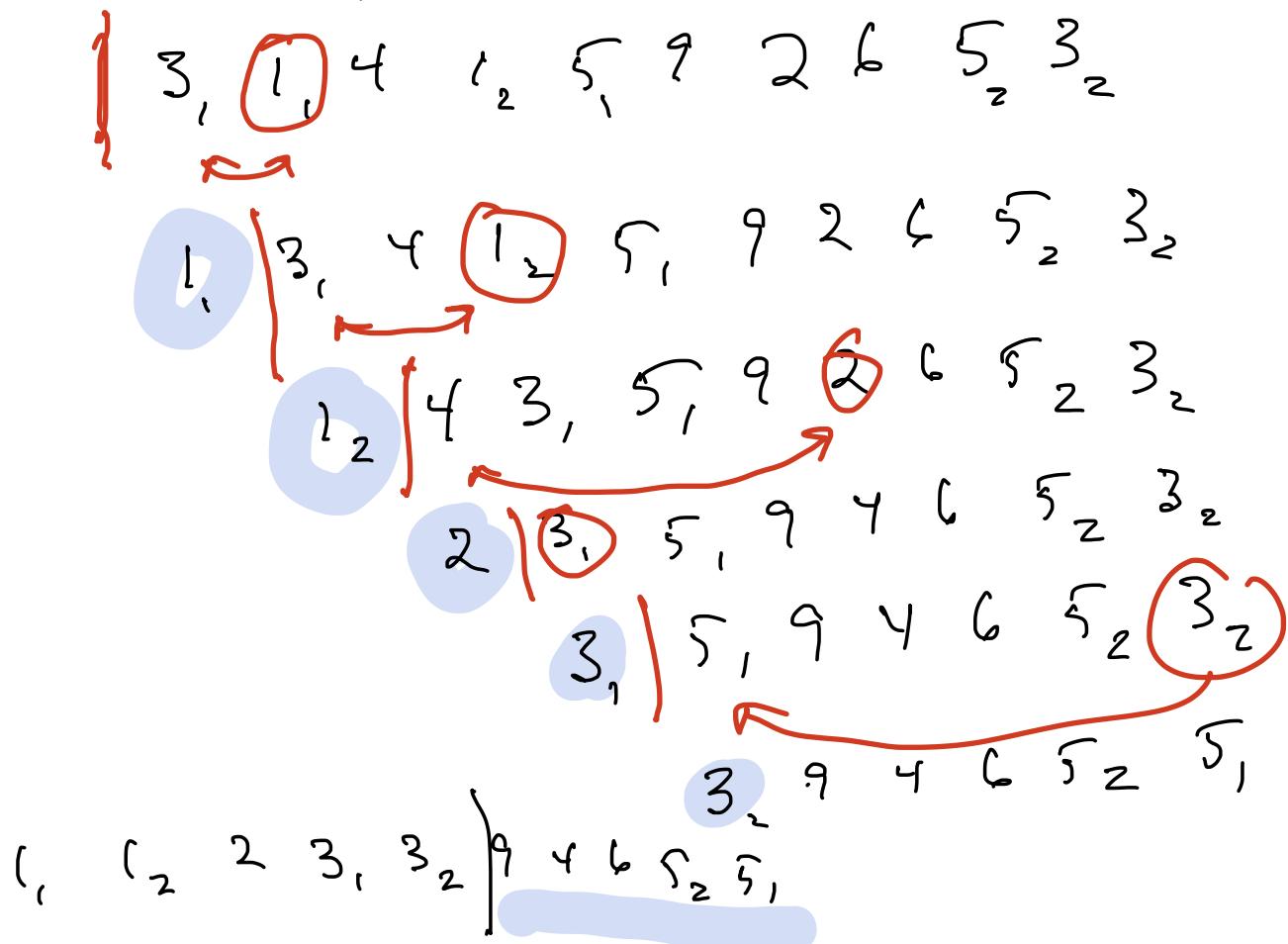
$1_1, 2, 3_2, 1_2, 4, 5_2, 6, 9, 8, 3$

2-d tree (2 dim, offline, bucket size 2)

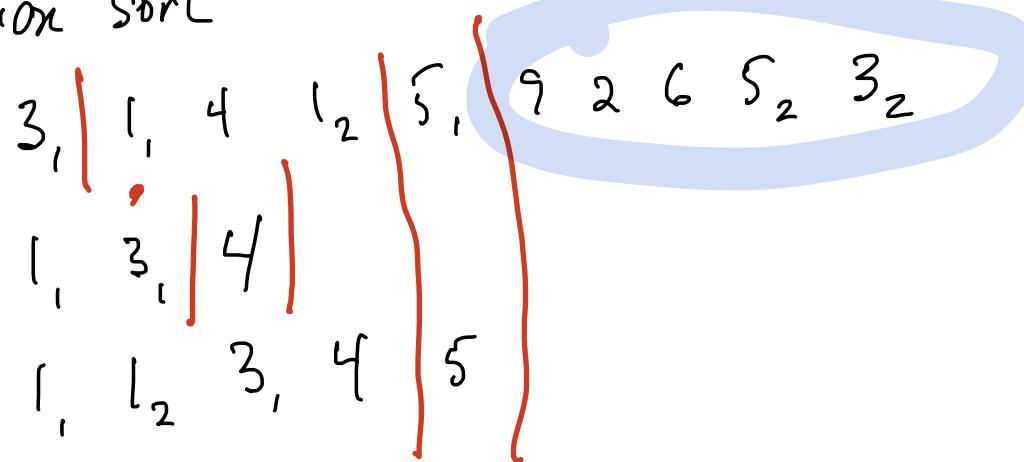
$(3, 1), (4, 1), (5, 9), (2, 6), (5, 3)$



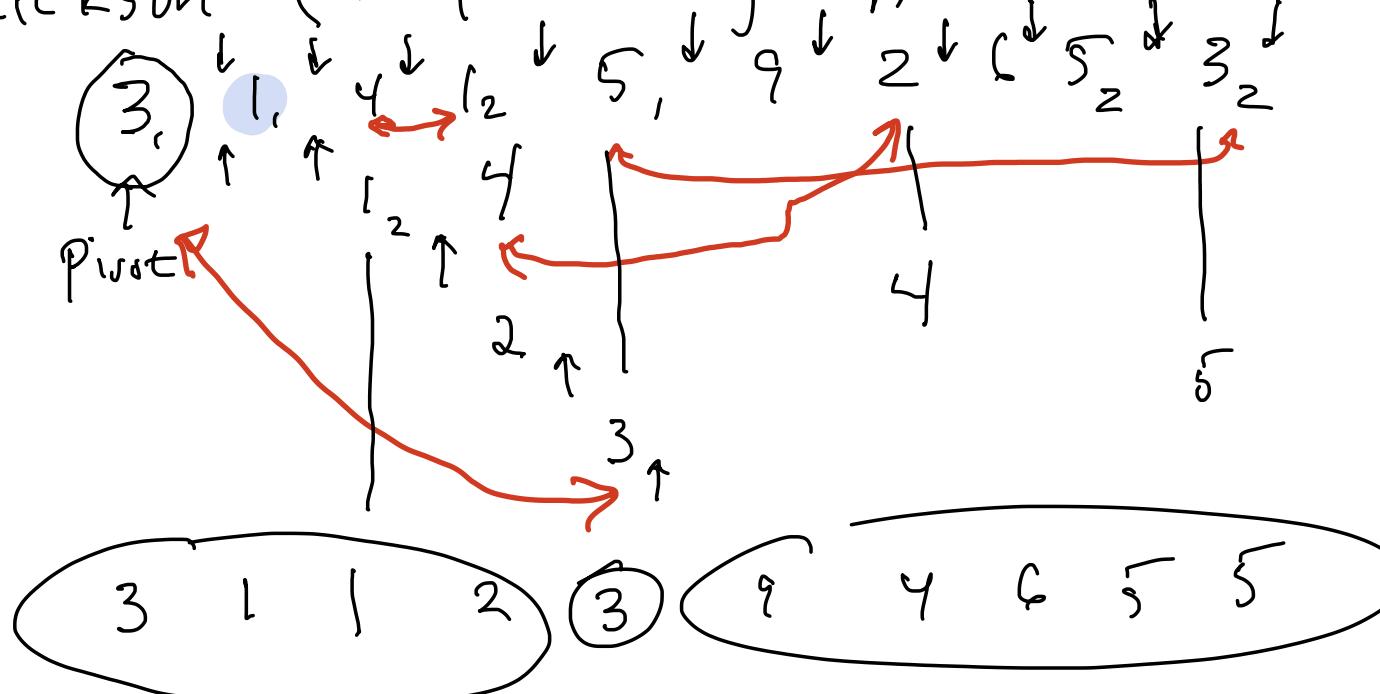
Selection sort : 5 steps.



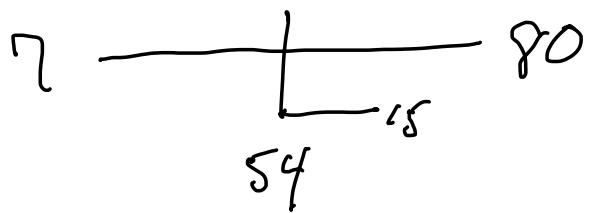
Insertion sort



Quicksort (1 partitioning step, Lomato)



# Score Range on Midterm

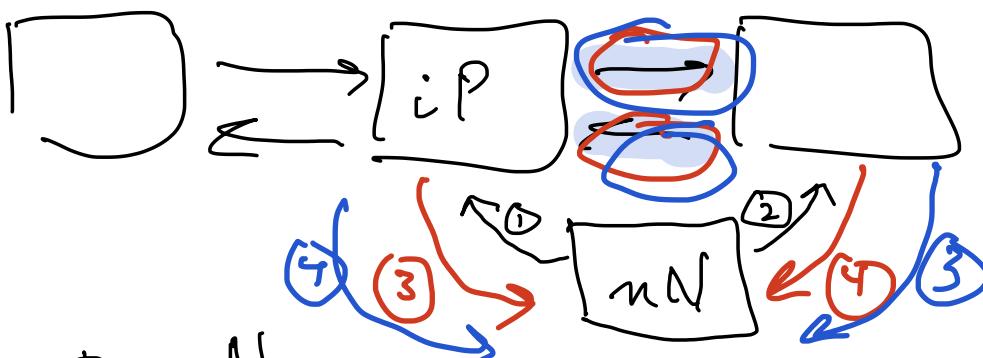


2b 423:

$$\Theta(n^2) \Rightarrow \Theta(1)$$


---

1a



- ③  $iP \rightarrow next = mN$
  - ④  $mN \rightarrow next \rightarrow prev = mN$
- ③**  $iP \rightarrow next \rightarrow prev = mN$
- ④**  $iP \rightarrow next = mN$

1b complexity:  $\Theta(n)$  average or worst-case

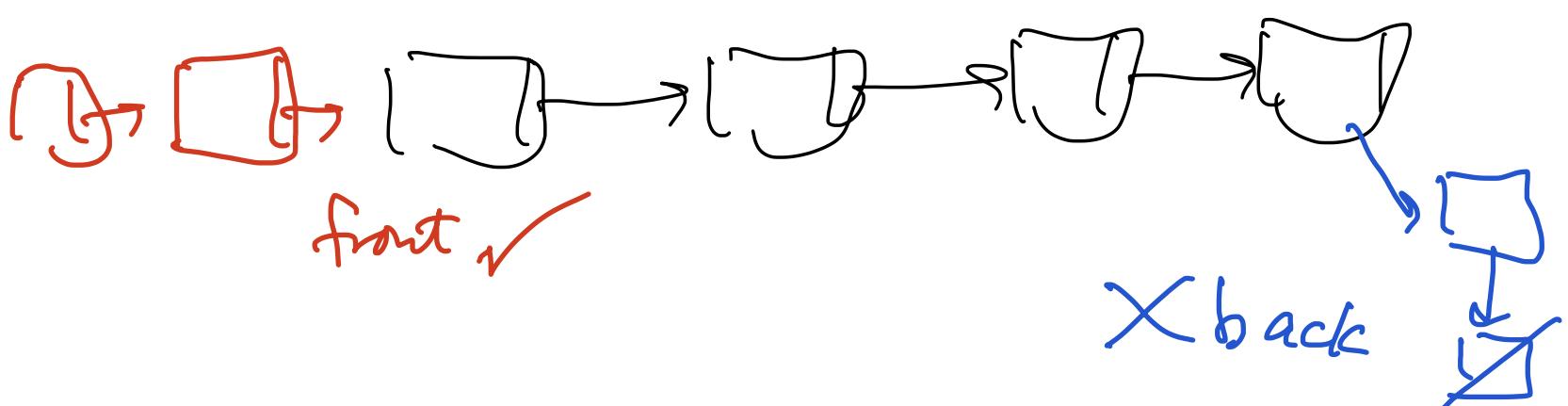
insertion:

sorted list

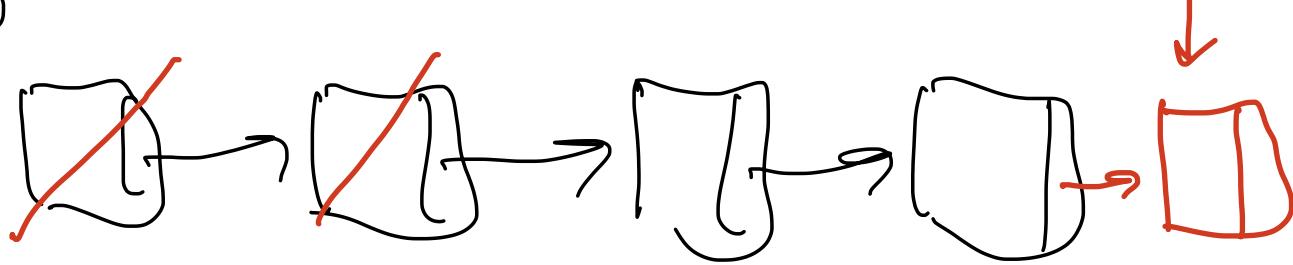
singly-linked



1c stack



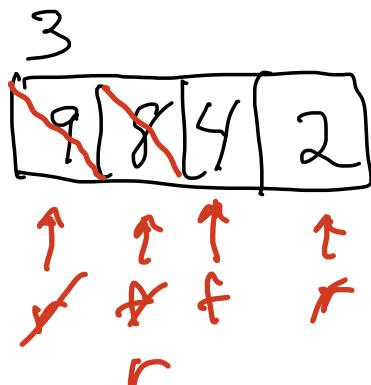
1d      queue.



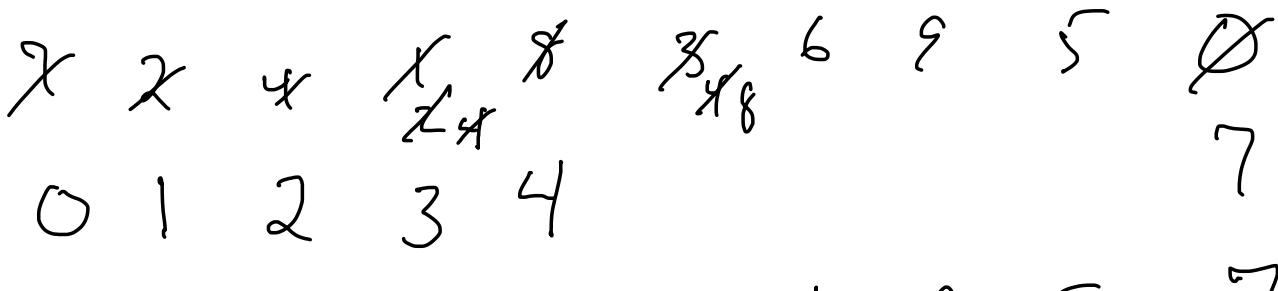
delete

insert

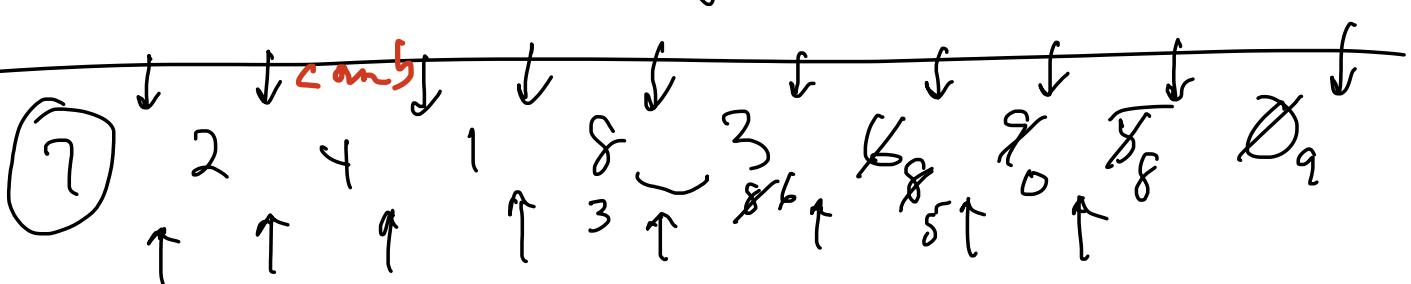
2a



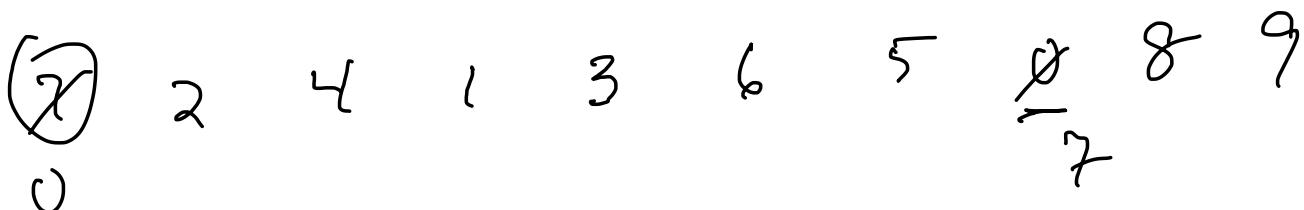
2b



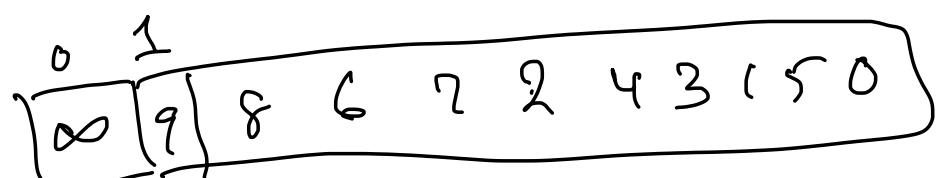
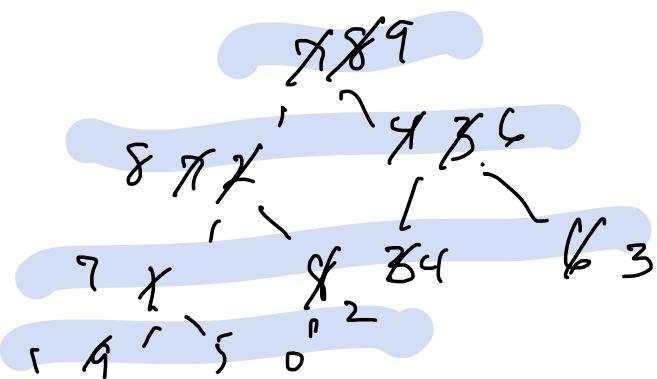
2c



end of small values

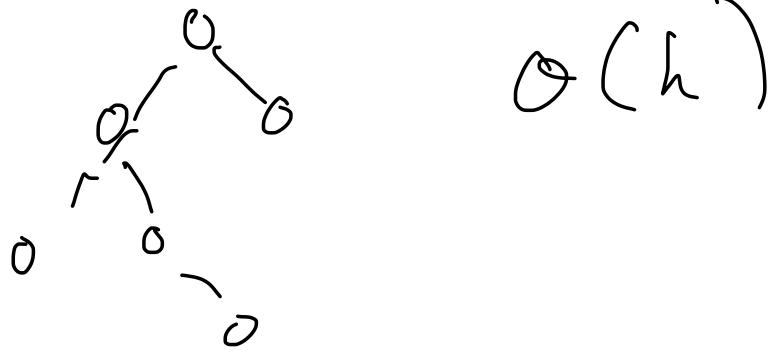


2d



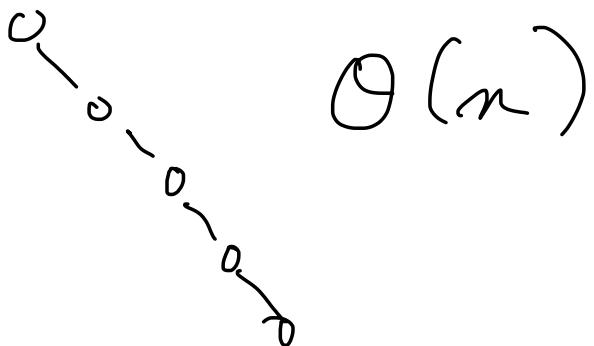
3 a sorted binary tree  
expected complexity  $\Theta(\log n)$

insertion



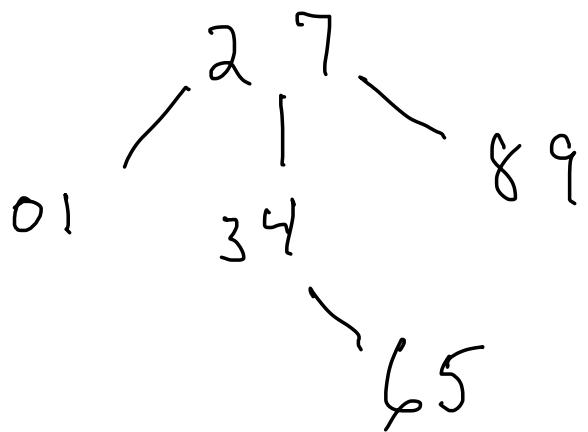
$\Theta(h)$

b worst case

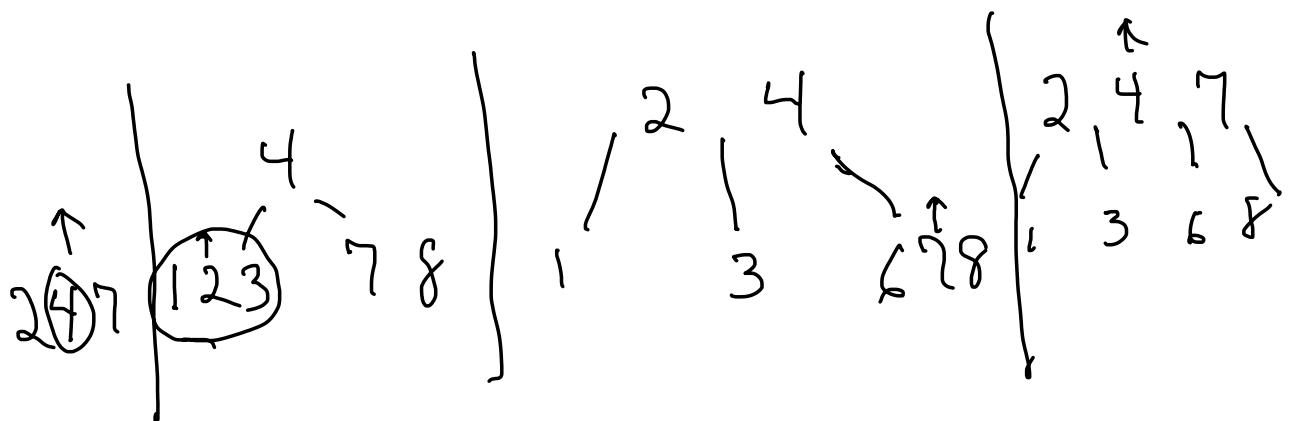


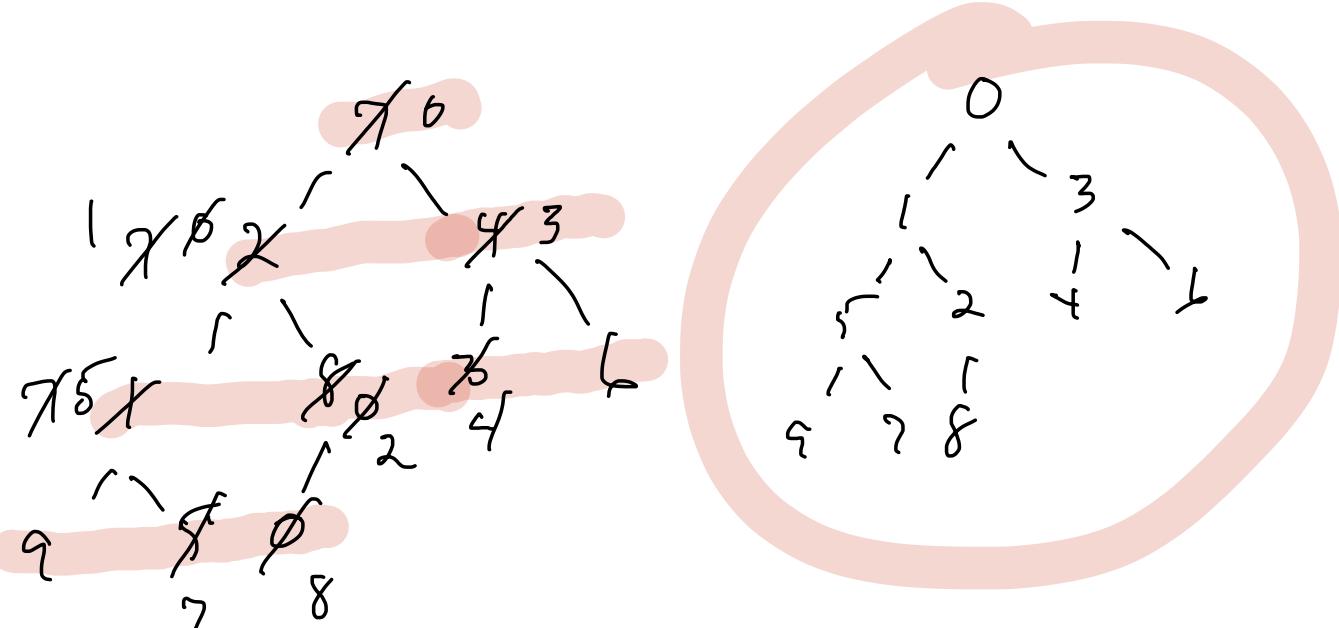
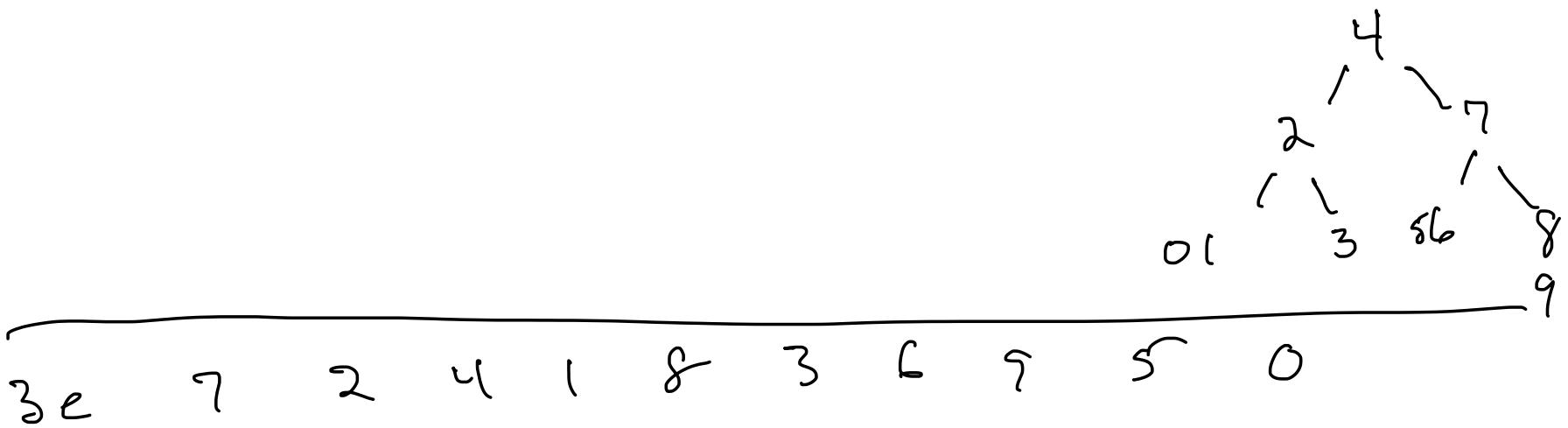
$\Theta(n)$

c. 7 2 4 1 8 3 6 9 5 0



3d 7 2 4 1 8 3 6 9 5 0





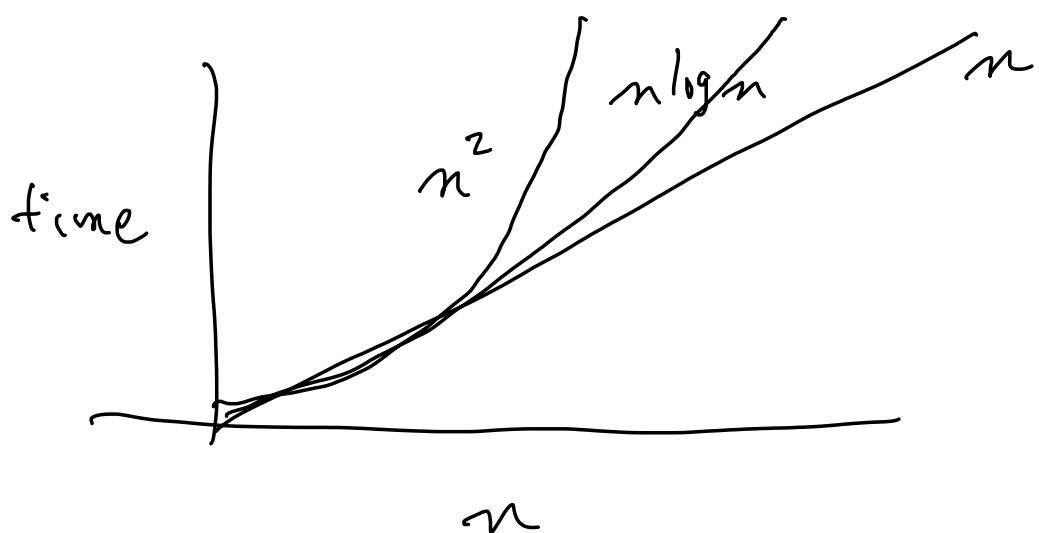
4 a) Why heap instead of bubble sort?

*guaranteed.*

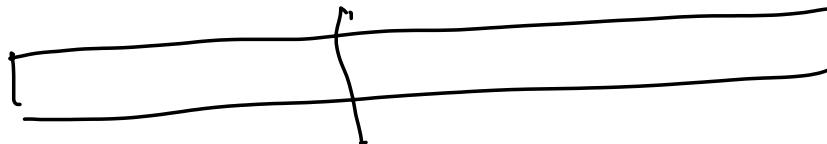
guaranteed.

$$\Theta(n^2)$$

$$\tilde{O}(n^2)$$

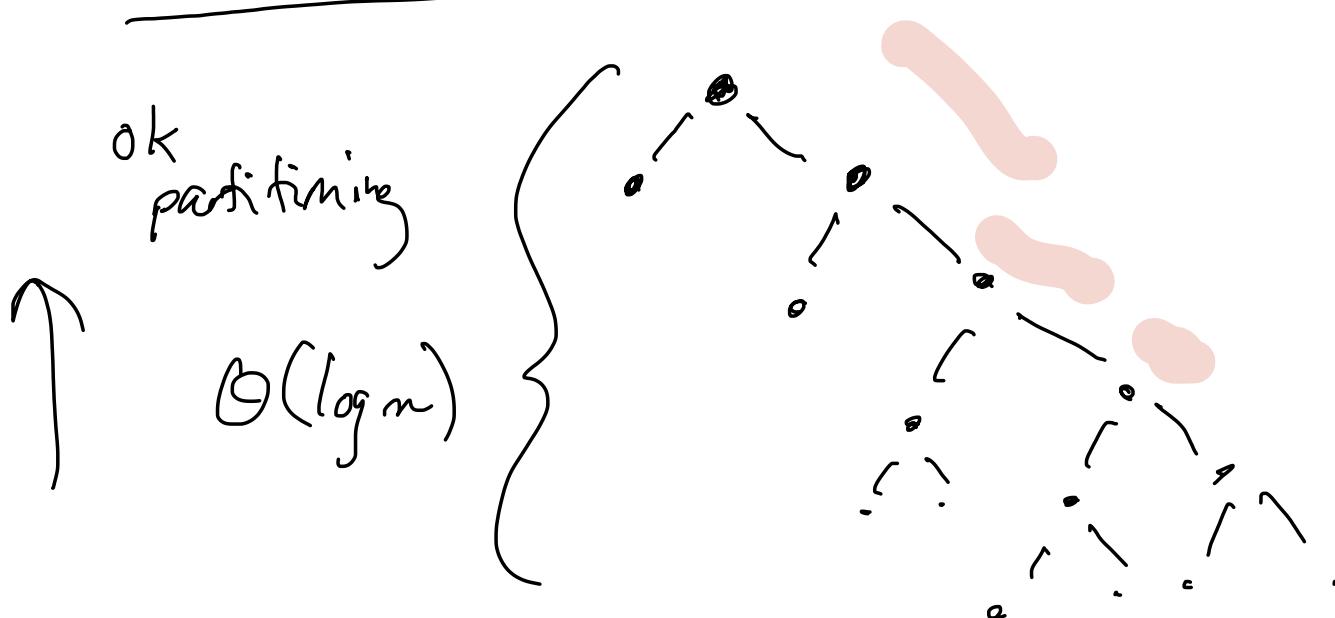
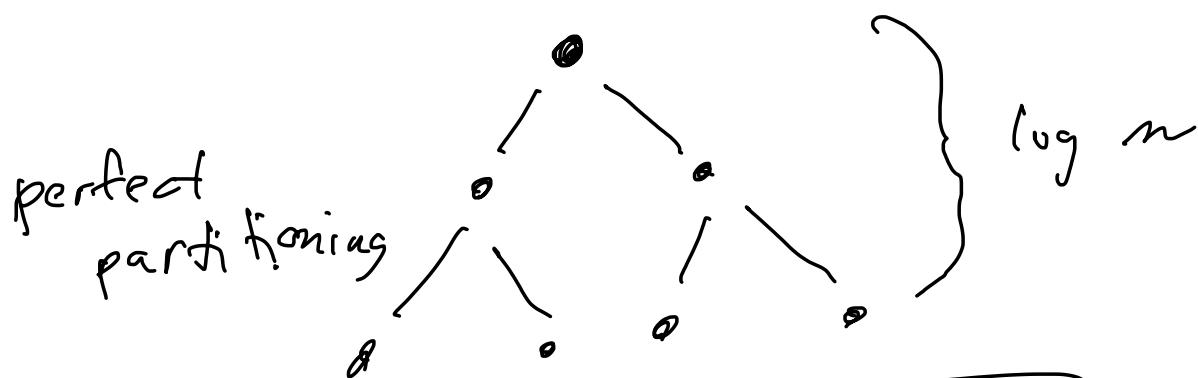


4b. why median of 3 (or 5)?



step 1: more likely to get a more balanced partition.

step 2: better balance  $\rightarrow$  shorter navigation tree



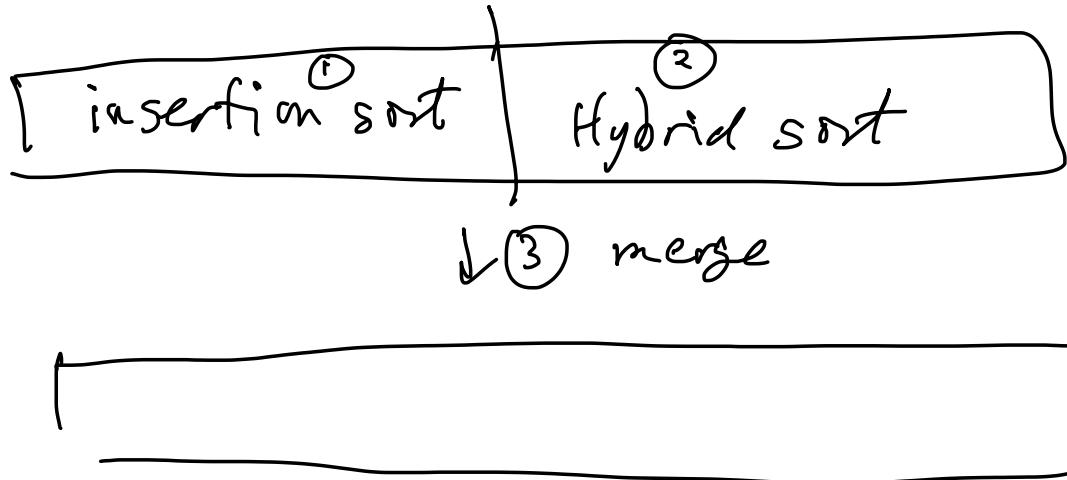
4c: 2nd largest element.

Sort, index:  $O(n \log n)$

quick select  $O(n)$  expected.

1 pass:  $O(n)$

#### 4d: Hybrid sort



$$C_n = f(n) + \alpha C_{n/b}$$

$$n^2 + n + 1 C_{n/2}$$

$$C_n = n^2 + C_{n/2}$$

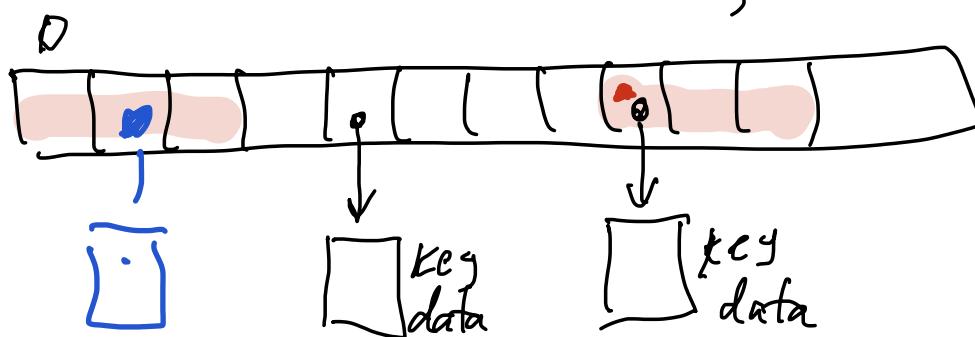
$$\left| \begin{array}{l} K=2 \\ a=1 \\ b=2 \end{array} \right.$$

$$\begin{array}{r} a \\ 1 \\ \hline b \\ 4 \\ \hline \Theta(n^k) \end{array}$$

$$\Theta(n^2)$$

#### Hashing

Key (typically a string)  $K$   
 apply a hash function  $h(k)$   
 returns number, used as an array index



open addressing: if there is a collision, place the new key in some other cell.

method: linear probing

$$p_i = (h(k) + i) \bmod s \quad i=0\dots$$

very bad: clusters

advice:  $s \geq 3 \cdot (\max \# \text{ of entries})$

to search:

for each  $p_i = (h(k) + i) \bmod s \{$

if  $A[p_i]$  is empty, return failure.

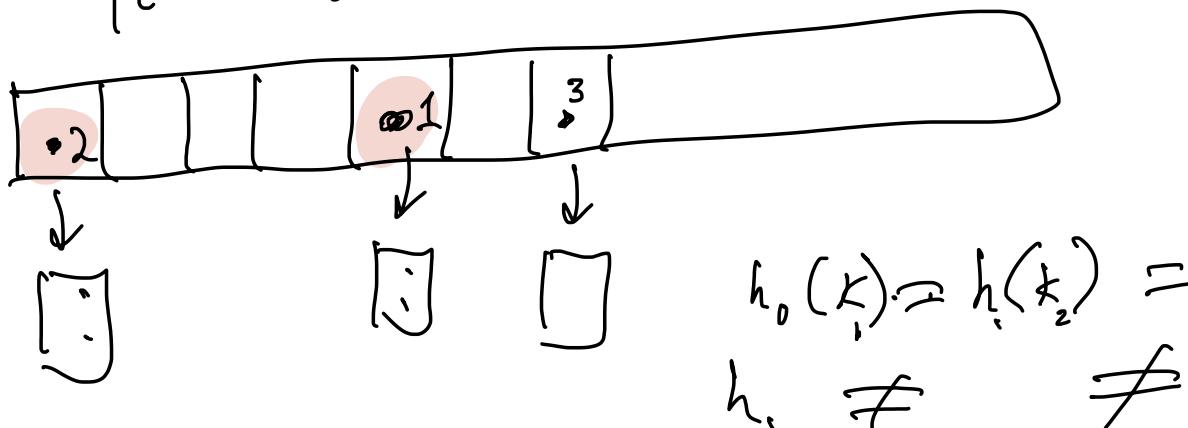
if  $A[p_i] \rightarrow \text{key} = k$ , return success ( $A[p_i] \rightarrow \text{data}$ )

}

// very bad case: table is full  
return failure.

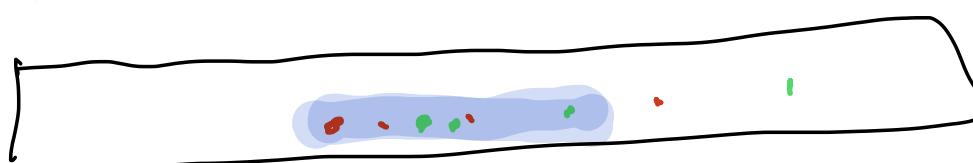
method: family of hash functions  $h_0(\cdot), h_1(\cdot) \dots$

$$p_i = h_i(k)$$



method: quadratic probing

$$p_i = (h(k) + i^2) \bmod s$$



still clustering, secondary

method: add-the-hash rehash

$$P_i = (h(k) \cdot (i+1)) \bmod S$$

don't use 0 index of array.

S should be prime so that  $P_i$  eventually try all cells.

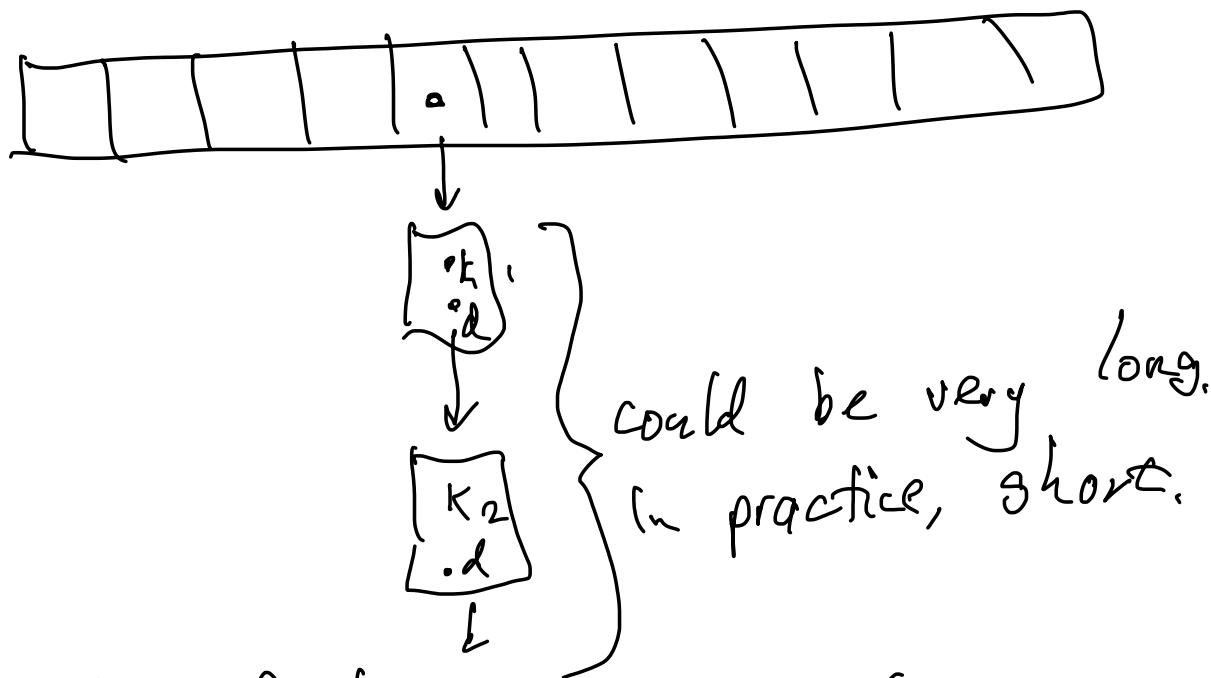
method: double hashing

$$P_i = (h_1(k) + i \cdot h_2(k)) \bmod S$$

$\downarrow$   
never 0

---

Alternative to open addressing: external chaining



$S \approx \# \text{ of elements to insert}$

on average, each chain has length 1.

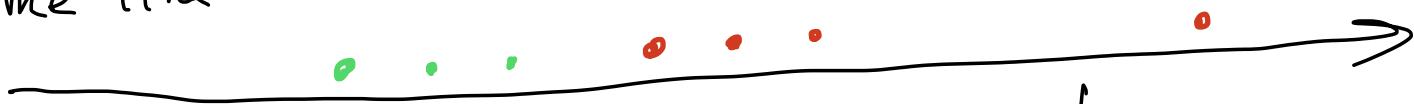
cost of insertion:  $\Theta(1)$  (average)

to insert  $k$ : (without duplicates)

let  $i = h(k)$   
for each node  $d$  in list headed by  $A[h(k)]$   
verify  $d.key \neq k$ .

Build new node  $\alpha = \{k, \text{data}\}$   
 Insert  $\alpha$  in list headed by  $A[h(k)]$   
 at beginning, especially if search / insert  
 show "locality of reference"

time line



advice: insert at start of chain  
 when searching, move success node  
 to start of its chain

to search for  $k$ :

Let  $i = h(k)$   
 for each node  $d$  in list headed by  $A[i]$  {  
   if  $d.\text{key} == k$ , return success  
 }  
 return failure.

Alternative to representing chain as a list

binary tree, 2-d tree, ...

better: use larger  $S$ .

What is a good  $h(\cdot)$ ?

- fast.

- examine all of  $K$ . (up to a reasonable limit)

- uniform:  $0 \dots S-1$  equally likely.

- spreading (not important for external chaining)

Similar key should hash to very different values.

In practice: key is a sequence of bytes,  $b_i$

method :  $(\sum_i b_i) \bmod s$

$j = \lceil \log_2 n \rceil$

expected capacity

fast if  $s = 2^j$  for some  $j$   
mask the lower  $j$  bits  
eg:  $j = 4$  mask (binary)  
with 0000 111

method:

for  $b_i$  do:  
value = value \*  
 $2^{37} + b_i$ ;  
answer = value  
 $\bmod s$ ;

method :  $(\sum_i b_i \ll i) \bmod s$ .

method :  $(\bigoplus_i b_i \ll i) \bmod s$

wisdom: not important what  $h()$  you use,  
as long as it's not silly.

How big should  $s$  (array size) be?

prime if using quadratic probing, ...  
(open addressing)

$2^j$  so that  $\bmod$  is fast

if expect  $n$  elements, set  $s \approx n$ .

(external chaining)

What if  $s$  turns out to be too small?

- 1) Live with it.
- 2) Rehash all elements into a bigger table  
(pause in computation)
- 3) extendible hashing : split chains  
binary tree, trie (split on last bit)

Modern programming languages have hash tables built-in.  
(associative arrays)

Perl:  $\$a\{k\} = \text{data}$

JavaScript:  $a[1] = a['string']$

Java : library HashMap

Python:  $\text{Foo} = \text{dict}()$

$\text{Foo}['this'] = 'that'$

---

## Cryptographic hashes (digests)

$h(\text{text}) = \text{number} (\text{represented as a string of hex digits})$

Purpose: uniquely identify text.

goals:

fast computation

uninvertable

given  $h(k)$ , ~~impossible~~ to derive  $k$ .  
infeasible

collision-proof :

infeasible to generate a collision

Examples: MD5  $h(k)$  is 128 bits.

Practical attack in 2008

SHA-1 160 bits

Generating a collision in  
 $2^{69}$  operations. (2005)

SHA-2

variants: SHA256 (256 bits)  
SHA512 (512 bits)

Uses:

① Storing passwords: store user name, digest (password)  
`/etc/password`

② catching copying: verify that excerpts of submissions are unique.

③ authentication: want to prove that I sent message  $m$ .

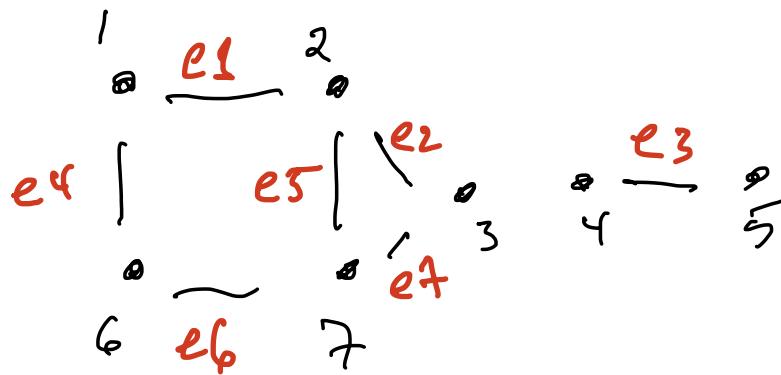
shared secret  $s$  between sender (A) receiver (B)  
 $h(m + s)$

④ intrusion detection: store hash of every essential program in a protected file.

Compare  $h(\text{file content})$  with stored value.

(tripwire) (the digest of a program is called its signature)

# Graphs



vertex (vertices)  
edge e

graph properties: connected? (no)

directed? (yes)

edges have a direction →

weighted? (no)

edges have a numeric value (weight)

vertex properties: sparse? (somewhat) / dense (not very)

fanout / fanin

directed

degree

undirected

vertex 2

has degree 3.

graphs represent

1) streets in a city (vertices are corners, edges are streets)

want to compute paths. (sequence of edges)

2) airline routes.

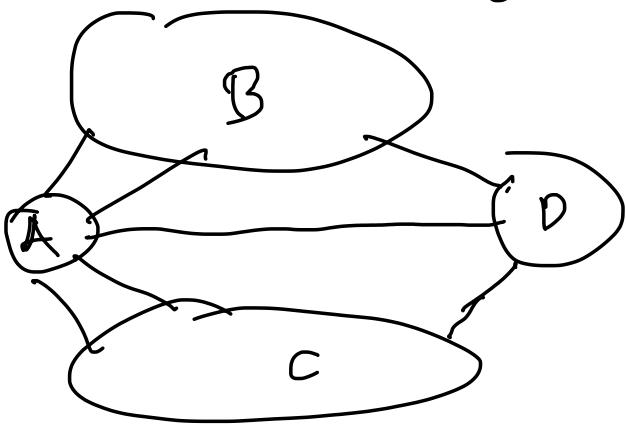
weight of an edge: cost of ticket

minimal-cost cycles

Hamiltonian cycle: visit every vertex once.

Eulerian cycle: visit every edge once.

### 3) Bridges of Königsburg (later Kaliningrad)

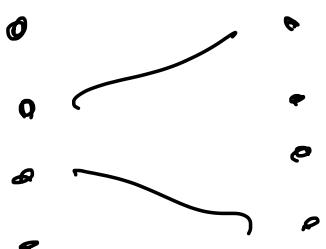


Eulerian cycle exists  
iff # vertices  
with odd degree  
0 or 2, (?)

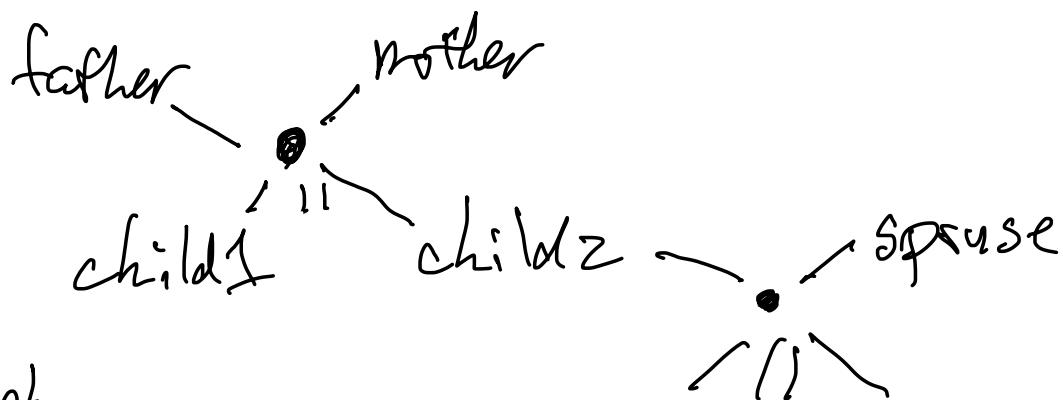
### 4) Family trees.

Bi-partite graph: 2 kinds of vertices

Edges only connect vertices of different kinds.

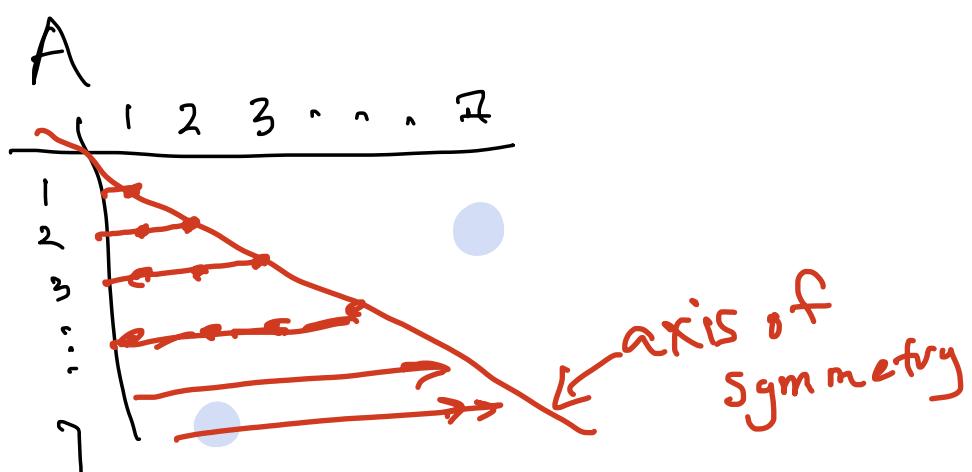


Two kinds: people  
families



To represent a graph.

#### • Adjacency matrix



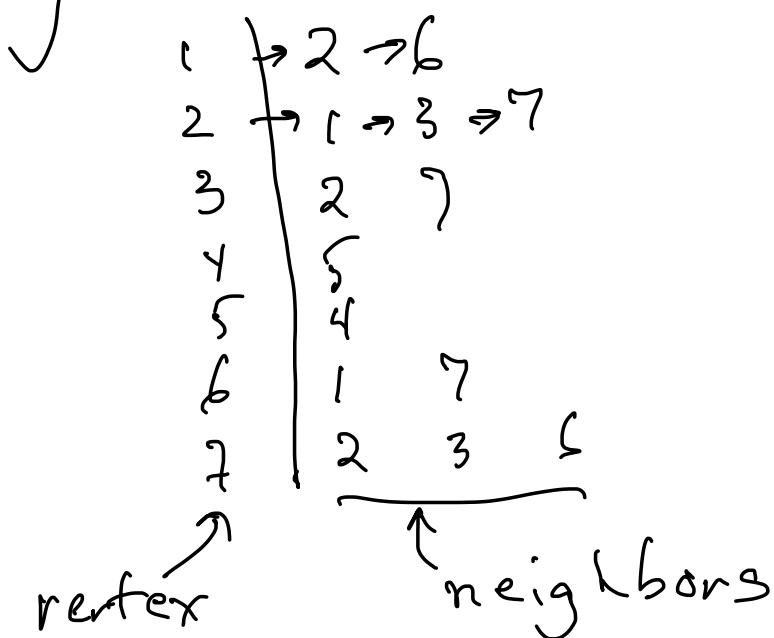
$A[i, j] \geq \text{true}$  iff [edge connecting vertex  $i$  to vertex  $j$ ].  
use a 1-dimensional representation!

$A[i, j]$  stored at  $\underline{A[i(i-1)/2 + j]}$

$A[3, 7]$

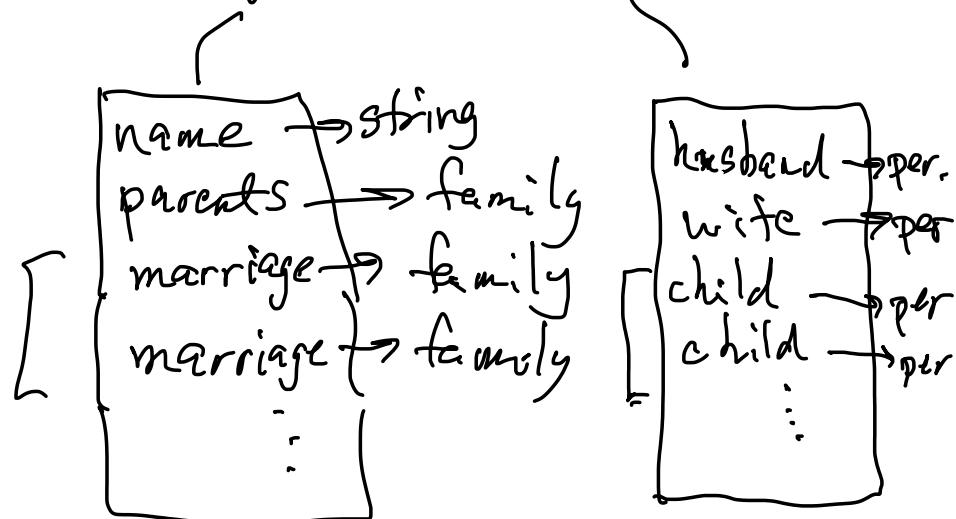
$A[\frac{3 \cdot 2}{2} + 7] = A[10]$  1 dimensional.

- Adjacency list



- Special representations

family tree : structures for people families



Compute the degree of all vertices number of vertices

matrix    foreach vertex ( $0..v-1$ ) {

    degree[vertex] = 0;

foreach neighbor ( $0..v-1$ )

        if  $A[\text{vertex}, \text{neighbor}]$

$\Theta(v^2)$

            degree[vertex] += 1;

Adjacency list

$\Theta(v + e)$

```
foreach vertex (0 .. v-1) {  
    degree[vertex] = 0;  
    for (neighbor := L[vertex];  
         neighbor != null;  
         neighbor = neighbor->next)  
        degree[vertex] += 1  
}
```

Connected component of vertex  $i$ :  $\{ \dots \}$

Algorithm: Depth-first search (DFS)

```
void DFS(vertex i)  
// assume visited[*] = false at start  
foreach neighbor (i) {  
    if !visited[neighbor] = true  
    visited[neighbor] = true  
    DFS(neighbor);  
}
```