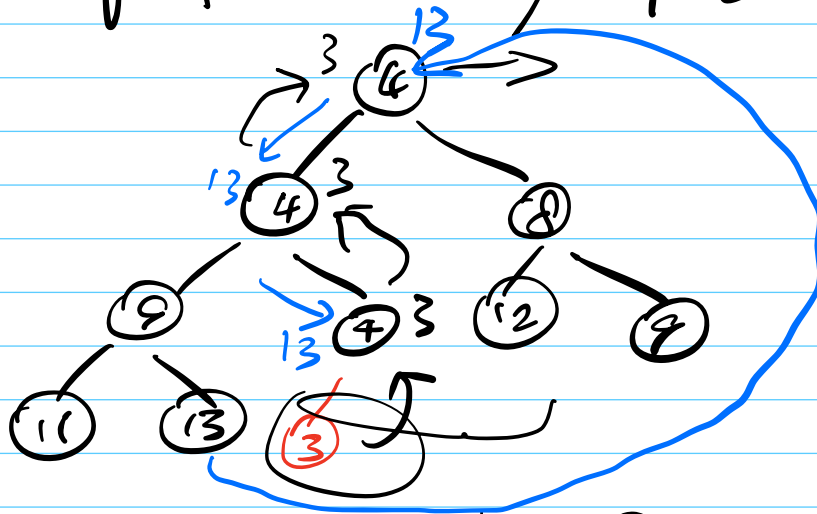


0. Warm-up.

Heap property: for every object  $x$   
key of  $x \leq$  keys of children.



a. is it a valid heap? ✓

b. Insert(3) Bubble up! Time:  $O(\log n)$

c. Extract-min Bubble down

Swap w/ smaller child

Time:  $O(\log n)$

If your app.: requires fast  
min/max on an evolving set of obj's.  
Heap is usually the choice of D.S.

d. Given Heap w/  $n$  obj's.  
 which can be solved in  $O(1)$   
 insert & Extract-min ?

✓ a. Find obj w/ 5<sup>th</sup> smallest key.

x b. obj. max key

x c. obj. median key  $\frac{n}{2} = \Theta(n)$

d. none of the above

1. Hash table.

a. app: 2-sum.

Input: unsorted array  $A$  of  $n$  integers.  
 & target sum  $t$ .

Goal: Determine  $\exists ? x, y \in A$   
 s.t.  $x + y = t$

☹️ check all pairs  $(x, y)$   $x + y \stackrel{?}{=} t$ .  
 $\rightarrow \binom{n}{2} = O(n^2)$

☹️ ① sort  $A$   $\Theta(n \log n)$  (Heap Sort)  
 ② for each  $x \in A$   
 look for  $(t-x) \in A$   $O(n \cdot \log n)$   
binary search  $\rightarrow$

$\Rightarrow \Theta(n \log n)$

① insert  $n$  elem's of  $A$  into Hash table  $O(n)$

② for each  $x \in A$  look  $t-x \in H$   $O(n)$

$\Rightarrow O(n)$

! A lot more apps.

b. Implementations.

- Setup: -  $U$ : universe (Big!)

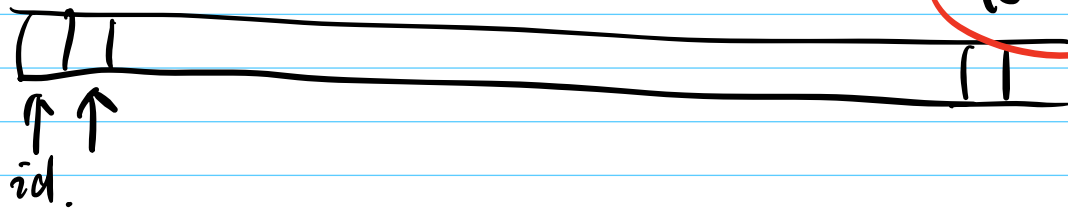
Ex:

key	
2D	Name ...
01...9 <u>(0 dist)</u>	Alice

- maintain evolving set

$S \subseteq U$   
 $\uparrow$   
(eg. CS students)

• Implement as an array

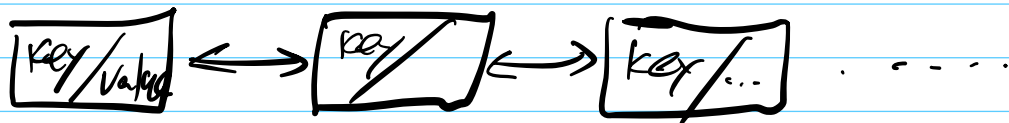


(+) constant look up.  $\mathcal{O}(1)$   
insert / del.

(-) space-costly  $\sim 10^{10}$   $\Theta(|U|)$

• Implement as linked list.

$s, |s|$



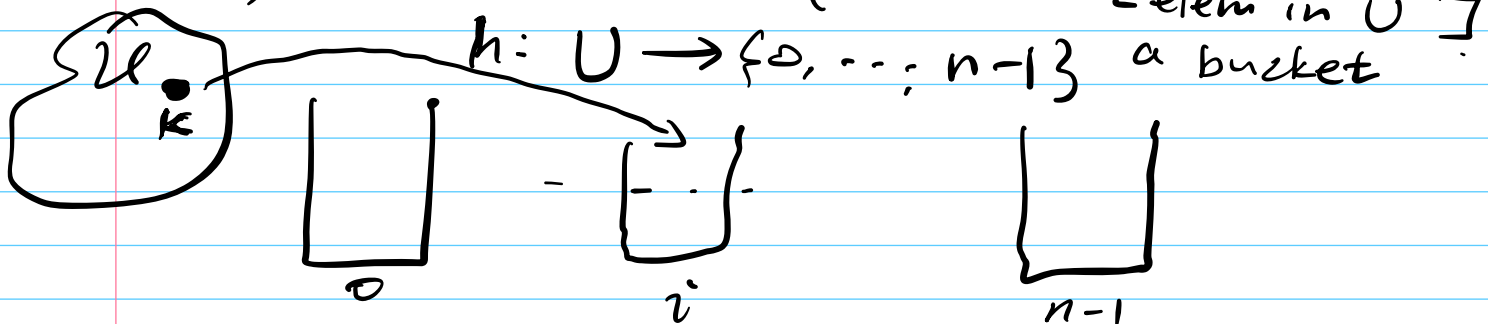
lookup:  $\mathcal{O}(|s|)$

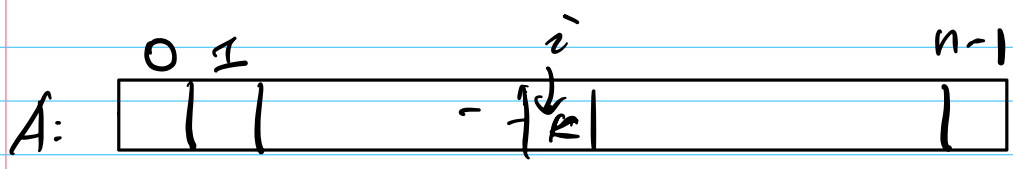
space:  $\mathcal{O}(|s|)$

★ solution: (H.T: buckets + hash func.)

1) pick  $n = \#$  of "buckets"

2) choose a hash function [assign every elem in  $U$ ]





$h(k) = i$       Array of size  $n$ .  
 $A[h(k)] = k$ .

😊 look up:  $O(1)$

😊 space:  $O(n)$      $n = \Theta(|S|)$   
 $\uparrow$   
 $\Theta(|S|)$

! Devils come w/ the pigeons

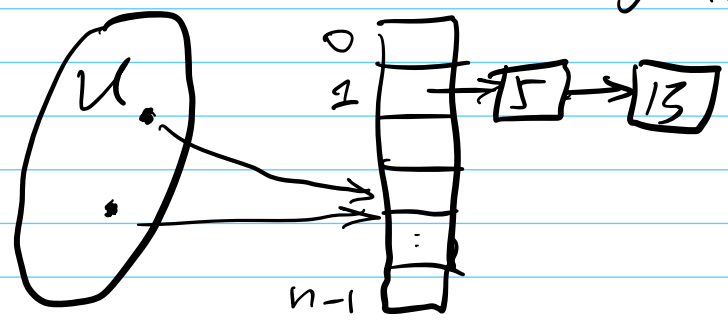
c. collisions:

distinct  $x, y \in U$  s.t.  $h(x) = h(y)$

Two soln's:  
 {  
 • chaining  
 • open addressing

• chaining:

e.g.  $h(5) = h(13) = 1$



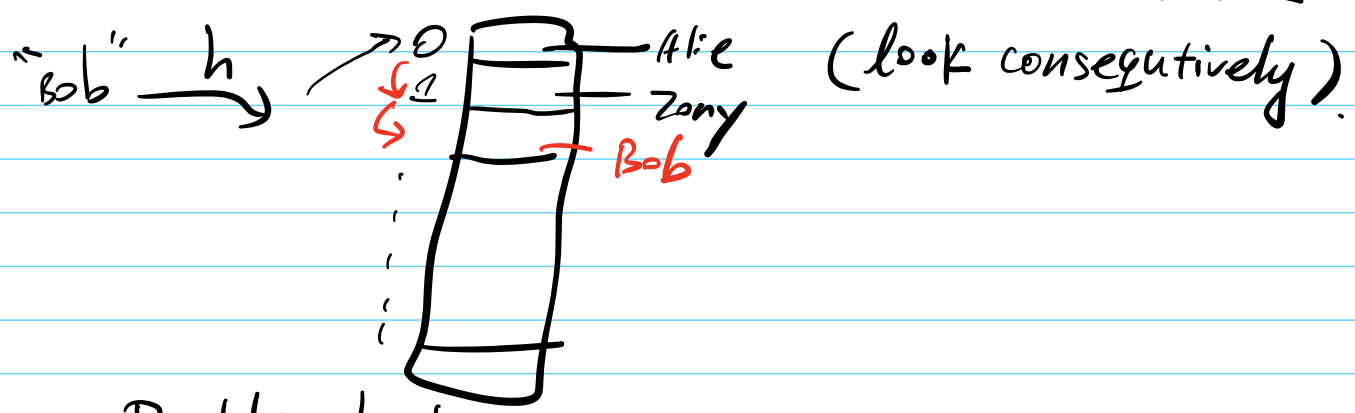
- keep linked list in each bucket.
- Given a key  $k$ : ins/del/lookup  $A[h(k)]$  in the list.

• open addressing

Idea: try multiple bucket until available  
 associate each  $k$  w/ a probe sequence

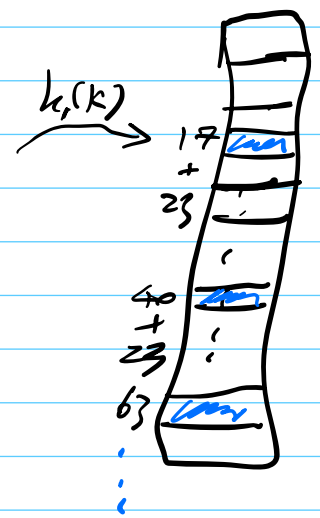
How to choose probe sequence?

- linear probing.  $h(k) \rightarrow h(k)+1 \rightarrow h(k)+2$



- Double hashing.
  - $h_1(k)$  starting point
  - $h_2(k)$  offset

$h_1(k) = 17$   
 $h_2(k) = 23$



★ Take-away:

- Regardless of resolving strategy:  
H.T. performance downgrades w/ collisions
- choice of hash function matters!  
e.g.  $h(x) = 0 \forall x$  Terrible!

Ex: A hash table length  $n \geq 1$

- Hash function:  $h: x \mapsto [n] \forall x \in U$ .
- Set  $S$  inserted in hash table  $|S| \leq n$ .

What's the typical running time of subsequent Lookup op's?

	chaining	&	open addressing (linear)
A.	$\Theta(1)$		$\Theta(1)$
B.	$\Theta(1)$		$\Theta( S )$
C.	$\Theta( S )$		$\Theta(1)$
✓ D.	$\Theta( S )$		$\Theta( S )$

⇓ what is a "good" hash function?

Random  $h: U \rightarrow [n]$

for  $k \in U$ ,  $h(k)$  chosen  
indep. and uniformly at random  
 from  $\{0, \dots, n-1\}$ .