

20 JAN - 26 JAN

# Hashing

Insert, search, delete.  $O(1)$ .  
no successor & predecessor.

Keys should be immutable

- hashing with chaining.
  - insert  $O(1)$  worst

m key, n items.  $\rightarrow O(m+n)$  space  
 $\rightarrow O(1 + \frac{n}{m})$   
 $\frac{n}{m} \approx O(1)$

$$\text{load} : \frac{n}{m} = \alpha$$

Worst case: all hash to one  $\rightarrow$  sorted array ( $O(\log n)$ )  
 General case:  $O(n)$  worst for search/remove. Insert still  $O(1)$  tho

max expected  $\frac{\log n}{\log \log n}$

Poisson dist



## Open Addressing

- search  $\rightarrow$

hash(key, 0)  
h(key, 1)  
h(key, 2)

When full, cannot search & insert anymore

$\rightarrow$  need resize

- delete  $\rightarrow$

tombstone

WORST CASE still  $O(n)$

if insert sees tombstone  $\rightarrow$  just change to new var.

2 prop of good hash

- $h(\text{key}, i)$   $0 \leq i \leq m-1$  permutation of  $\{0, \dots, m-1\}$   $\exists i$  s.t.  $h(\text{key}, i) = j$
- $\forall \text{key} \rightarrow$  prob slot to key  $i = \frac{1}{m}$   $\forall i$

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What about double hashing??

$$h(\text{key}) = f(\text{key}) + i \cdot g(\text{key}) \cdot \text{mod } m$$

relatively prime  $m = 2^a$

	Worst / Avg	Search	Insert	Del
Sorted Arr	$\log n$	$N/N/2$	$N/N/2$	$N/N/2$
Unsorted LL	$N/2$	$N/2$	$N/2$	$N/2$
Linear probe	$N/2$	$N/2$	$N/2$	$N/2$

double hash: hard to implement here

$$\text{Load } \alpha = \frac{n}{m}$$

expected cost of search & insert

$$\frac{1}{1-\alpha}$$

better cache (array) over LL.  
sensitive to  $\alpha$  & hash

m bucket

n items inside it

as  $\alpha \rightarrow$  bad

$$\alpha < 0.75$$

$$\frac{n}{m} \cdot \left( \frac{1}{1-\alpha} \right)$$

$$\left( 1 - \frac{n}{m} \right) + \frac{n}{m} \left( 1 - \frac{n-1}{m-1} \right) +$$

$$1 - \alpha + \alpha \left( 1 - \alpha \right) +$$

$$1 + \frac{n}{m} \left( 1 + \frac{n-1}{m-1} \right) +$$

$$1 + \alpha \left( 1 + \alpha \left( 1 + \alpha \right) + \dots \right)$$

$$\frac{1}{1-\alpha}$$

Linear probing usually choose  $M = 2n$

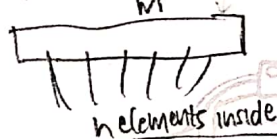
To grow table  $= O(\text{old} + \text{new})$   
 if  $m \leq \frac{n}{2} \rightarrow m \rightarrow 2m$   
 $m \geq \frac{n}{4} \rightarrow m \rightarrow \frac{m}{2}$

27 JAN - 2 FEB

Key idea: storing **big keys** <sup>long strings</sup> image } is costly.  
 so use fingerprints → DO NOT store key in table

maybe false positives  
 NO FALSE NEGATIVES

Prob of false positives:



$(1 - \frac{1}{m})^n \approx (\frac{1}{e})^{\frac{n}{m}}$   $1 - \frac{1}{m}$ : P(one bit is not set after mapping of 1 obj)

Trade off:  
 P a query return a false ⊕ = P an ans bit is set =  $1 - (1 - \frac{1}{m})^n$   
 ⊕ less space to store key  
 ⊖ bigger table to reduce collisions

$\Leftrightarrow \frac{n}{m} \leq \log \frac{1}{1-p}$   
 $\Leftrightarrow m \geq \frac{n}{\log \frac{1}{1-p}}$

② Bloom Filter → 2 hash fn. → map to 2 bits.  
 Search = true if both bit is true.

P a query return false ⊕ =  $(1 - (\frac{1}{m})^2)^n$

What about k hash fn → there is optimal number

$k = \frac{m}{n} \ln 2 \rightarrow P_{error} = 2^{-k}$

Why PQ is natural for heap!!  
 PQ & heaps

insert, extract Min, decrease key (decrease priority)  $O(\log n)$   $O(\log n)$   $O(\log n)$   
 lookup, delete, insert

need to bubble down

usually combined with AIT < priority, Nodes/val, Array slots  
 might be  $O(n)$  w/o a HT

• All leaves are to the left

Complete Binary Tree  
 max Height:  $\lfloor \log n \rfloor$

remove: swap w/ last, then bubble down  
 insert: add at last, then bubble up.  
 extract Max: swap root w/ last, then bubble down from root

HeapSort: extract max → put at the back  
 UNSTABLE safe because at extract max, we have swapped last to idx 0  
 Worst case  $n \log n$   
 In place space  $O(1)$

Heap successor:  $O(n)$  → searching whole array.

# NOTES

Graphs as adjacency list :  $O(V+E)$  space  $\rightarrow$  good for.  
as matrix :  $O(V^2)$  space  $\rightarrow$  good for

sparse graphs.  $\rightarrow$  good for dense graph  $\rightarrow$  good for  
 $\checkmark$  list all neighbor  $O(n)$   
 $\checkmark$  any  $O(1)$   
 $\times$  are  $v$  and  $w$  neighbor  $O(n)$   
 $\times$  find any neighbor  $O(n)$   
 $\times$  are  $v$  and  $w$  neighbors? random access  $O(1)$   
 $\times$  list all neighbor  $O(n)$

there is some order  
 Directed Graphs as adj. list.  
 $\rightarrow$  scheduling

$O(V+E)$  space  $\rightarrow$  only maintains outgoing/ingress edge.

$O(V^2)$  space  $\rightarrow A[v,w] = v \text{ to } w$  not symmetric anymore



DAG iff Topo Order

DAG  $\rightarrow$  TOPO SORT  $O(V+E)$   $\downarrow$  Topo Order  
 post-order DFS =  $O(V+E)$   
 put to the back.  
 process a node iff all outgoing edge have been processed!  $\rightarrow$  put to back  
 (i.e. process node after calling DFS-not recursive call)

Algo 1

Repeat:  
 -  $S$  = all node w/ no incoming edge  
 - add Nodes to topo order  
 - Remove all edge adj to  $S$   
 - remove  $S$  from graph  
 each  $v$  only processed once

Algo 2  
 Kahn

Strongly connected component  
 $\exists$  path  $v \rightarrow w \& w \rightarrow v$   
 Graphs of strongly connected component is cyclic.

BREAK TIME

Week 4 to Recess Week  
 AY 19/20 Sem 2

class NeighborList extends Arraylist

class Node {  
 value: int key  
 NeighborList nbors  
}

class Graph {  
 Node[]



exploring all paths  
might be exponential.

DO NOT  
VISIT EVERY  
PATH POSSIBLE

FEBRUARY 2020

# efflorescence

→ min number of HOPS  
P.S. In unweighted graph = shortest path.

BFS → recursive Iterative: use Queue.

DFS → recursive Iterative: use Stack!

For all  $v \in V$ :  
If (!visited[v])  
DFS-visit(v)

DFS-visit (Node start).  
Process (start)  
for all  $v \in \text{Neighbor}(\text{start})$ :  
If (!visited[v]):  
Visited[v] = true  
DFS-visit(v).

frontier: new ArrayList <>  
frontier.add(start)  
While (frontier not empty)  
nextfrontier.add(frontier.  
children)  
frontier = nextfrontier

Only visit each node once.

Need to keep track visited in RECURSIVE

(adj) flowers blooming; growth and development

$O(V)$  space

NOTES

BFS / DFS :  $O(V+E) \rightarrow$  adjacency list  
↑  
store visited[]  
 $O(V^2) \rightarrow$  adjacency matrix.  
BFS → shortest path → since only visit every node once and visit in order  
 $O(V+E)$

that is why space = use list

• each node only visited Once

DFS → In adjacency matrix:  $O(V^2)$

• each neighbour of node is enumerated.

searching neighbours:  $O(V)$ .

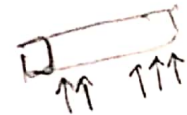
detect cycle?

↳ In adj. list ~ length of list  
↳ In adj matrix ~  $O(V)$  per node

BFS & DFS ← doesn't guarantee SP (except tree?).

Queue Stack

→ if not visited



FEBRUARY 2020

# Shortest Path

NO REWEIGHT

3 FEB - 9 FEB

BF → relax every edge → repeat V times.

(SSSP)

V-1 times + 1 times

check for  $\infty$  / end.

SPFA  
avg O(E)?

use Queue.  
Only relax in Q.  
after relax put back to Q.

Invariant: at  $i^{th}$  iteration, at least  $i$  node has been final. ( $i$  Hop is correct)

at  $i^{th}$  iteration, we have find all SP of at most length  $i$  from the SOURCE

Detect  $\infty$  cycles

BF don't work for Graph w/  $\infty$  cycles but can detect

Dijkstra

Relax in correct order, so only relax every edge ONCE

Invariant: at each iteration → add 1 node to **final**

build  
Shortest Path Tree

modify relax + decrease key / insert

Priority Queue.

Binary Heap:

- deleteMin: swap w/ last, remove, bubble down

AVL Tree

- deleteMin()

- insert

- decreaseKey

- contains

- HT (keys)

- (idx in tree)

- Insert: insert at end, bubble up.

decreaseKey: delete (swap, remove) + insert

contains: HT (idx & value).

relax (int u, int v)

if (dist[v] > dist[u] + weight(u, v))

dist[v] = dist[u] + weight(u, v);

SEMESTER 2 WEEK 4

3 FEB - 9 FEB

DA6

Why Topo order?

o If  $P = S \rightarrow X \rightarrow D$  is SP from S-D

Then P also contains SP from S-X, X-D

o Path relaxed s.t. dist get relax is  $\infty$

undirected, no cycle

Longest path on DAGs →  $\infty$  the edges

Input	
Whichever	BF, O(V <sup>2</sup> )
Unweighted all same	BF O(V+E)
Tree	BFS/DFS O(V)
NonNeg Edges	Dijkstra O(E log V)
DAGs	Topo Relax O(V+E)

Queue BFS: Take V discovered least recently (HTU) most (LTU)

Stack DFS

PO: Dijkstra take V closest to source

Idea: Maintain set of explored vertices.  
- add V by following e that go from explored → unexplored

At every step we add an edge crossing the cut (if in MST lang)

Repeat:

- Find unfinished vertex w/ smallest estimate
- Relax all outgoing
- Mark vertex finished

Basic Idea: maintain dist estimate.

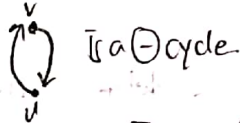
	ins	deMin	deKey	
Array	1	V	1	V <sup>2</sup>
AVL	log V	log V	log V	E log V
d-way heap	d log V	d log V	d log V	E log V
Fib heap	1	log V	1	E log V

Undirected? replace  $(u,v)$  w/  $u \rightarrow v$  &  $v \rightarrow u$ .

Dijkstra?  $\rightarrow$  cannot have neg edges.

So if your undirected graph all has  $\oplus$  edge

BF?  $\rightarrow$  no  $\ominus$  cycle. If  $u,v$  has neg weight then



It's a  $\ominus$  cycle.

So, also not possible. Just use Dijkstra.

### LONGEST PATH

Topo sort + Relax

$\ominus$  all edge / modify relax

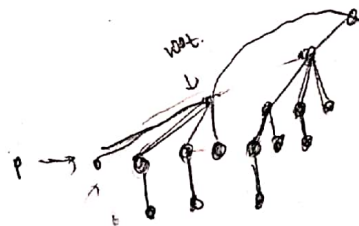
$\hookrightarrow$  DAG

$\hookrightarrow$  general cyclic graph  $\otimes$  can have positive weight cycle

$\downarrow \ominus$

negative weight cycle

our SP algo's will fail  $\rightarrow$



### UF-DS

$\rightarrow$  to support Kruskal & Boruvka.

Data Structure: Id Array.

key	1	2	3	...	8
parent, size					

Objects  $\rightarrow$  HT  $\rightarrow$  integer + Open Addressing

Quick Find:  $O(1)$  find,  $O(n)$  union.

$\text{union}(p,q)$ : all el in component  $q \rightarrow$  change parent to  $p$ .

Quick Union:  $[O(n)]$  find  $[O(n)]$  union  $\rightarrow \text{union}(p,q) = \text{parent}(\text{parent}(p)) = \text{parent}(q)$

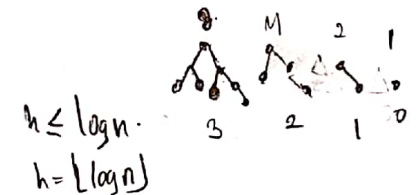
$\hookrightarrow$  have to search for both parent  $\rightarrow O(n)$  in skewed tree

PROBLEM

Introduce Path Compression // Weighted.QU.

$[O(\log n)]$  find,  $[O(\log n)]$  union

WQU  $\rightarrow$  Height only  $\uparrow$  iff 2 trees of same  $h$  is combined.



Ackermann f.

WQUPC:  $O(x(m,n))$  find,  $O(A)$  union

Worst case ~~WQU~~ WQUPC:  $O(n)$   
WQU:  $O(\log n)$



17 FEB - 23 FEB

MST cannot be used to find SP.  
but can be used to find minimax.

Network Design  
bottleneck

- 1) No cycle → a tree? Cut an MST → 2 MSTs
- 2) Cut an MST → 2 MSTs → BUT:  $\forall$  cut, can have  $> 1$  edge connecting (lightest edge, no guarantee!) → can be heaviest on other cycle
- 3) Cycle property: heaviest edge on every cycle → RED
- 4) Cut property: min edge crossing a cut → BLUE (min outgoing edge of every node in MST ✓ because if cut node → everything else max outgoing edge not in MST X)

Generic MST - color R/B for every edge

on termination →  $\forall$  cycle,  $\exists$  1 red edge  
→ blue edge → forest  
→ blue edge, MST, if not  $\exists$  cut, no blue edge.

**PRIM** → BLUE-only strategy (each added edge is lightest on some cut)

PRIM vs Dijkstra

edge weight	estimate + edge weight (distance)
-------------	-----------------------------------

keep extra arr of distTo[]

initialization:

- all  $v \rightarrow \infty$
- start  $\rightarrow 0$

HashMap <Node, Node> parent

HashSet <Node> seen

Dijkstra don't visit  
but each node can only  
visit once.

DS used

$O(E \log V)$

space:  $O(V)$

Prim:  $\forall$  insert  
E decrease key  
V extract Min

DS-used (UF D-S).

space:  $O(V)$

**KRUSKAL**

→ sort, then use UDS to determine (find) whether it's connected / not  
sort  $O(E \log E) \times (E \log V)$   
↓  
do nothing / union & save edge.

+ use RED & BLUE strategy.  
find/union  $E \times O(\log V)$   
or  $E \times O(A)$

$O(E \log V)$

**BORUVKA**

→ use UDS  
→ parallelizable

- 1) Add all odd edges (i.e) cut property corollary  
→ add min edge out of every component / subset

@ the beginning, all nodes are component.

One boruvka = "step"  
- search for min outgoing edge  $\forall$  component  
- add to MST  
- contract / merge connected components in (union)  
iterate through cheapest  $\times$  (union)

find parent - store in cheapest (parent) BFS/DFS per component  
OR  
iterate through edgelist and store it in same cheapest

There is  $\log V$  boruvka step. (each step:  $V \rightarrow \leq \frac{V}{2}$  CC)

Boruvka:  $O(E \log V)$  cheapest  
 $O(V)$  merge components

24 FEB - 1 MAR

Input  
unweighted/homogeneous  
edges range  $\{1 \dots k\}$   
constant  $k$

BFS/DFS  $\rightarrow V-1$  edges only (guaranteed).  
 $O(V+E)$

diff  $\forall$  SP problem is that  $S \rightarrow T$  might vary in length, DFS doesn't guarantee shortest

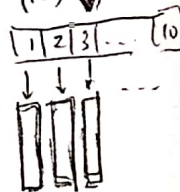
① Kruskal Variant!

① sort:  $O(E)$ . Use  $k$  buckets, iterate through array.

② UF:  $O(\alpha E)$

$\rightarrow$  connect/not (find) union

Total:  $O(\alpha E)$



② Prim Variant

PA how?  $\rightarrow$  if outdated, next extractMin

$O(V)$  - extractMin  $\rightarrow O(1)$  just iterate  $1 \dots k$   
- contains  $\rightarrow$  HashSet.

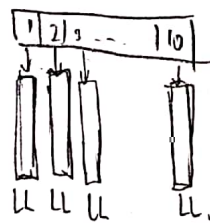
$O(E)$  - insert  $\rightarrow O(1)$  access +  $O(1)$  LL insert.  
- decreaseKey  $\rightarrow$  lazy deletion??

$O(V+E)$ .

2OPT

$G' \leq 2OPT$

$T \leq G'$



Directed MST  $\rightarrow$  Arborescence Problem on Rooted Tree 24 FEB - 1 MAR

- $\forall$  node reachable on path from root.
- no cycles

Classic Algo doesn't work.

DAG w/ one root

$\forall$  node not root, add min. incoming edge  
 $O(V+E)$

Max ST

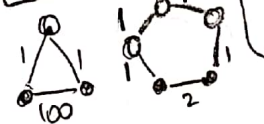
$\rightarrow$  reweight ( $\pm$  constant doesn't matter. WHY? it is  $\pm c(V-1)$  for all results)

just - all edges  
run MST (find most = negative).

or sort Kruskal descending (?)

or Prim's PQ max-heap instead of min-heap.

Steiner Tree



MST of a subset of graph, but can use other nodes optionally (Steiner nodes)  
(required nodes)

Approximation Algo

- ①  $\forall$  pair, find shortest path  $\leftarrow$  SP (weight).
- ② construct new Graph  $G(V', E')$
- ③ MST on new Graph  $G$
- ④ map back to original graph

Sketch

Proof: DFS on Opt.

$\rightarrow$  twice each edge

$\rightarrow$  kill Steiner nodes

nodes all on  $G'$

and subset of its edges

$T$  is MST on  $G'$



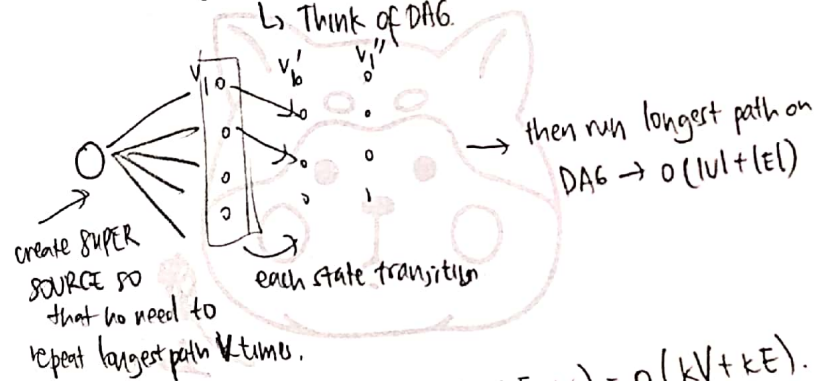
# NOTES

DP / memo

Longest Increasing Subsequence  
 longest ending at - fr → back  
 longest starting at - fr ← back  
 $O(n^2)$

Prize Collecting

- Detect cycle: BFS / DFS  
 max possible income w/ max k edges travelled.  
 (longest path problem)



$$O(V+E) = O(kV+1) + kE+V = O(kV+kE).$$

space  $O(kV)$

DP approach:  $P[v, k]$  starting from  $v$  take  $k$  steps } max amount can be collected.

$$P[v, k] = \max \{ P[w_i, k-1] + w(w_i, v) \}$$

$w_i \in \text{Neighbor of } v$ .

- $kV$  subproblems @  $v$  neighbors
- $O(kV^2)$
- total  $O(kE)$  ← total row:  $k$   
 ← each row: each row =  $O(E)$ .

Table View

	$v_1$	$v_2$	$v_3$	...	$v_k$
0					
1					
2					
...					
k					

Vertex Cover

Input: rooted, unweighted, undirected tree  
 return size of vertex cover.

Subproblems: included  $\leftarrow$  children include  
 not included  $\leftarrow$  children not included  
 ↳ all children must be included

$2^V$  subproblems  $\times O(V)$  for each /  $O(E)$ .



AND IT CONTINUES

Week 7 to Week 10  
 AY 19/20 Sem 2

add MIN/MAX problem

Subproblem of SP: If  $u \rightarrow v \rightarrow w$  is SP from  $u \rightarrow w$   
 It is also SP  $u \rightarrow v$  &  $v \rightarrow w$

MARCH 2020

ineffable

(adj) too great to be expressed in words

## NOTES

APSP  $\rightarrow$  Run SSSP  $V$  times.  $\begin{cases} O(V(V+E)) \text{ BFS on unweighted} \\ O(VE \log V) \end{cases}$

Subproblem:  $A \rightarrow ? \rightarrow B$

$|P| = 0, 1, \dots, V-2$

$s[v, w, P]$

basecase:  $s[v, w, \emptyset] = E[v, w]$

$P_0 = \emptyset \quad P_{i+1} = P_i \cup \{i+1\}$

$s[v, w, P_{i+1}] = \min(s[v, w, P_i], s[v, i+1, P_i] + s[i+1, w, P_i])$



Making use of  
 subproblem  $u \rightarrow v \rightarrow w$   
 $u \rightarrow v, v \rightarrow w$

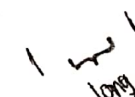

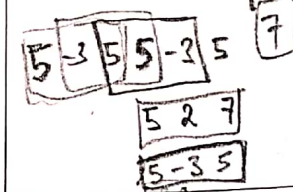
FW  $\rightarrow O(n^3)$

Filling in 3D-array start, end, set  
 $1, 2, \dots, V$

get ~~the~~ least significant bit:  $n \times n-1$

MARCH 2020

MONDAY	TUESDAY	WEDNESDAY
30 DFS detect cycle dfs (int v, int parent) { color[v] = 1	31	
2 for (int w: neighbors[v]) if (color[w] == 1) cycle? else if (color[w] == 0) dfs(w, v) }	4	
9 color[v] = 2	11	
16	17	18
23	24	25

THURSDAY	FRIDAY	SATURDAY/SUNDAY
		1
5	6	7
		8
12	13	14
		15
19	20	21
		22
26	27	28
		29