

bottom up DP using loops vs memoization

- no recursion easier to maintain, debug
- does not use stack space, can't overflow.
- small problems are solved first & immediately. So, at all times, we have ~~some~~ result and the memoization can reuse those results

Hash Table $\alpha = \frac{n}{M}$ # of keys / table size

INSERT
SEARCH
DELETE

simple Uniform Hashing
all keys are equally likely to hash into each of m slots ($P = \frac{1}{m}$)

Division hashing
hash = $h(x) / P$ $P = \text{Prime number}$
 $P > m$
not close to 2^n

Multiplication hashing
 $A = \text{const. in } [0, 1]$
hash = $\lfloor m (h(x) A \bmod 1) \rfloor$
 $m = 2^p$, p -bit hash
if $w = \text{word size}$, then
 $A = \frac{s}{2^w}$ $0 < s < 2^w$
fractional part $kA - \lfloor kA \rfloor$

multiply k by $s = A 2^w = r 2^w + r_0$
resulting p -bit hash is p -MSB of r_0

Universal hashing
pick a fn uniformly at random from a family s.t. $\Pr [h(k) = h(l)] \leq \frac{1}{m}$

$$f(n) \in O(g(n))$$

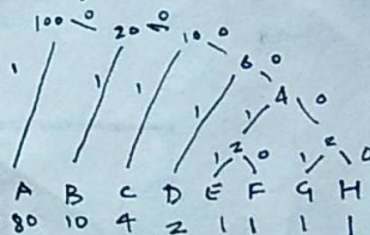
iff $\exists c, n_0$ $0 < f(n) \leq c g(n) \forall n > n_0$

divide & conquer

- BSEARCH $O(\log n)$
- INSERTION $O(n^2)$
- SELECTION $O(n^2)$
- MERGE-SORT $O(n \log n)$
- QUICK-SORT $O(n^2)$
- HEAP-SORT $O(n \log n)$

Lossless Compression
Huffman tree ← greedy

Sort chars in desc. order of frequency
merge min 2



$O(n \log n)$ using pq queue

Priority Queue

- INSERT per leaf $O(\log n)$
- MAX $O(1)$
- EXTRACT-MAX swap in last $O(\log n)$
- INCREASE-KEY move up $O(\log n)$
- MAX-HEAPIFY $O(\log n)$
- BUILD-MAX-HEAP $O(n)$
- $\frac{n}{2}$ to 1 heapify

$i = \text{left to right} - 1$

min left, first \times i, second \times right, second
+ opt - mul (left, i)
+ opt - mul (i+1, right)

$A_1, A_2, A_3, A_4, \dots, A_k$

cost-of-union + cost-of-parts

↑
DP

Minimum spanning Tree

spanning tree s.t. $\sum_{u,v \in E} w(u,v)$ is min.

Greedy approach

while not done

add a safe edge to MST

Safe edge = (u,v) such that $A \cup \{(u,v)\}$ is subset of some MST

Bohwtka

for each vertex, pick an edge of minimum weight adjacent to it
contract all connected components

$$E \log V$$

Prim

start with a vertex.

pick min weight edge vertex

repeat

update distance to all adjacent vertices

pick min weight vertex

$$V \log V + E \log V$$

$$O(E \log V)$$

relaxation step

if $v \in Q$ & $w(u,v) < v.key$

$$v.\pi = u$$

$$v.key = w(u,v)$$

distance to tree

Kruskal's

each vertex is a component

repeat

pick min weight edge connecting 2 components

$$E \log E + E \log V$$

$$= O(E \log V)$$

Light edge lemma:

if $A \subseteq$ some MST s.t.

$(s, v \setminus s)$ cut respects A

then any light edge for $(s, v \setminus s)$ is safe

Dijkstra's

init (s, w, s)

$s = \emptyset, Q = V$ ($s = \text{explored}, Q = \text{unexplored}$)

while Q

$u = \text{EXTRACT-MIN}(Q)$

$s = s \cup \{u\}$

for $v \in \text{Neighbors of } u$

if $v.d > u.d + w(u,v)$

$$v.d = u.d + w(u,v)$$

$$v.\pi = u$$

Relaxation step

or for each vertex u in topological order

for each $v \in \text{neighbors } u$

if $v.d > u.d + w(u,v)$

$$v.d = u.d + w(u,v)$$

$$v.\pi = u$$

Graph $G = (V, E)$

Search

init $u \cdot \text{color} = \text{WHITE}, u \cdot d = \infty, u \cdot \pi = \text{NIL}$
 $\forall u \in V \setminus \{s\}$
 $s \cdot \text{color} = \text{GRAY}, s \cdot d = 0, s \cdot \pi = \text{NIL}$

BFS

while Q

$u = \text{DEQUEUE}(Q)$

for v in neighbors of u

if $v \cdot \text{color} = \text{WHITE}$

$v \cdot \text{color} = \text{GRAY}$

$v \cdot d = u \cdot d + 1$

$v \cdot \pi = u$

$\text{ENQUEUE}(Q, v)$

$u \cdot \text{color} = \text{BLACK}$

$O(|V| + |E|)$

$O(|V|)$

DFS

time++

$u \cdot d = \text{time}$

$u \cdot \text{color} = \text{GRAY}$

for each v in neighbors of u

if $v \cdot \text{color} = \text{WHITE}$

$v \cdot \pi = u$

$\text{DFS}(G, v)$

$u \cdot \text{color} = \text{BLACK}$

time++

$u \cdot f = \text{time}$

$O(|V| + |E|)$

$O(|V|)$

Parenthesis: if $[u \cdot d, u \cdot f] \subseteq [v \cdot d, v \cdot f]$ then u is descendant of v .

White Path: v is descendant of u

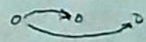
\Leftrightarrow when u turns gray, there is a white path from u to v

edges: undirected graphs only have tree or back edges
(no forward edge)

Topological Sort (DAG)

$O(|V| + |E|)$

output a list of vertices s.t. if $u \cdot v$ is an edge
then u is before v in the list



$\text{DFS}(G) \Leftrightarrow$

$(-v \cdot f)$ order is topological order

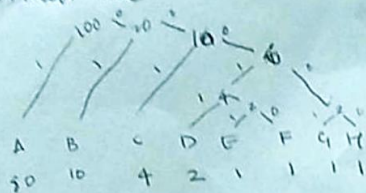
strongly connected component

maximal subset $C \subseteq G$ s.t. $\forall u, v \in C$ there is a path from u to v

call $\text{DFS}(G, \pi)$ but vertices are in topological order (in decreasing $v \cdot f$)

each tree in DFS forest is a SCC

Huffman tree



Division method.

$$h(k) = k \bmod m$$

avoid: $m = 2^p - 1$ for base 2
ex. 127 for ASCII characters

good: prime m not close to power of 2

linear	$h(k) = i$
quad	$h(k) = a_i + b_i + c_i$
double	$h_1(k) + i h_2(k)$

Multiplication method.

$$\begin{aligned} h(k) &= \lfloor m (kA \bmod 1) \rfloor \\ &= \lfloor m (\text{frac } kA) \rfloor \\ &= \lfloor m (kA - \lfloor kA \rfloor) \rfloor \end{aligned}$$

m : 2^p (p-bit hash)

w : word size (64 bit = 8B)

A : $\in [0, 1]$ $\frac{s}{2^w}$ $s \in (0, 2^w)$

$$kA = \frac{ks}{2^w} \Rightarrow \frac{1}{2^w} (r_1 2^w + r_0)$$

take p MSB of r_0

uniform hashing

each key x is equally likely to have any one of $m!$ permutations as probing sequence
probing seq ~ uniform (Permutation)

Universal hashing

$$\Pr_{h \sim H} [h(k) = h(l)] \leq \frac{1}{m}$$

$$E[n_{h(k)}] = \alpha$$

$$E[n_{h(k)}] = H \alpha$$

hash-table

U = universe of keys

K = set of keys used

T = table

m = # slots in T

h = hash function (ideally a random function)

$\alpha = \frac{n}{m}$ load factor $n = \# \text{ keys in } T$

Simple uniform hashing

$P(\text{key being hashed to slot } i) = \frac{1}{m}$

hash values of different keys are independent

SEARCH: $O(1 + \alpha)$

Universal hashing

H = set of hash functions

$\forall k, l \in U$: # hash functions s.t. $h(k) = h(l) \leq \frac{|H|}{m}$

$\Pr_{h \in H} [h(k) = h(l)] \leq \frac{1}{m}$

if h is sampled from universal family

k not in T $E[n_{hck}] \leq \alpha$

k in T $E[n_{hck}] \leq 1 + \alpha$

ex. p : prime $p > m$

$Z_p = \{0, 1, \dots, p-1\}$ $Z_p^* = \{1, 2, \dots, p-1\}$

$h_{ab} = ((ak + b) \bmod p) \bmod m$

$a \in Z_p^*$, $b \in Z_p$