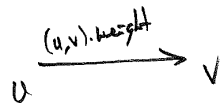


shortest paths problem

$G=(V,E)$   $w:E \rightarrow \mathbb{Z}$ ,  $s \in V$ ,  $t \in V$

Solve shortest paths problem with  $s$  as source.



$\delta(s,u) = u.distance$        $\delta(s,v) = v.distance$

Define an edge  $e=(u,v)$  to be tight if  
 $v.distance = u.distance + (u,v).weight$ .

$\Rightarrow$  there is a shortest path from  $s$  to  $v$  in which  $v.previous = u$

Consider subgraph  $H$  of  $G$  that contains  
 all tight edges of  $G$ .

Fact: Any path from  $s$  to  $u$  in  $H$  is  
 a shortest path from  $s$  to  $u$  in  $G$ .

If  $G$  has no cycles of negative or zero weight,  
 then  $H$  is acyclic (a DAG).

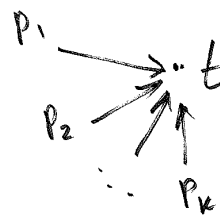
Counting shortest paths from  $s$  to  $t$  in  $G \equiv$  Counting  
 # of paths from  $s$  to  $t$  in  $H$

Count # of paths in a DAG ( $H$ )



Define  $N(t) = \#$  of paths from  $s$  to  $t$  in  $H$ .

$N(s) = 1$



$N(t) = \sum_{i=1}^k N(p_i)$  where  
 $p_1, \dots, p_k$  are nodes  
 that have edges into  $t$

In any topological ordering of  $H$ ,  
 $p_1, \dots, p_k$  all must precede  $t$ .

Go through nodes in topological order:  
 calculate  $N$ .

Enumeration — similar to enumeration of  
 topological orders.

## Skip Lists

Generalization of sorted linked lists for implementing Dictionary ADT (insert, delete, find, min, succ) in  $O(\log n)$  expected time per operation, where the  $n$  is the size of the dictionary. Skip lists compete with balanced search trees like AVL, Red-Black, and B-Trees.

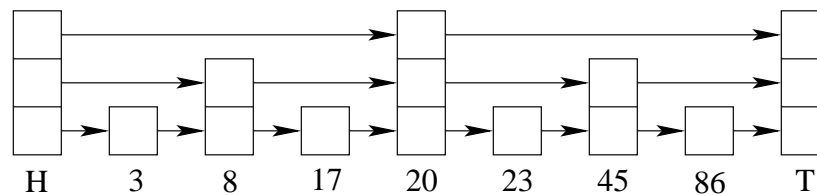
|         |
|---------|
| element |
| next    |

List Entry

|         |         |     |         |
|---------|---------|-----|---------|
| element |         |     |         |
| next[0] | next[1] | ... | next[k] |

Skip List Entry

The elements are stored in sorted order, in a linked list of nodes. Each skip list entry has an array of next pointers, where  $next[i]$  points to an element that is roughly  $2^i$  nodes away from it. The  $next$  array at each entry has random size between 1 and  $maxLevel$ , the maximum number of levels in the current skip list. Ideally,  $maxLevel \approx \log n$ . Each skip list has dummy head and tail nodes, both of  $maxLevel$  height, storing sentinels  $-\infty$  and  $+\infty$ , respectively. Iterating through the list using  $next[0]$  will go through the nodes in sorted order. A reference to the previous element can also be stored by adding a  $prev$  field to Skip List Entry.



Search starts at  $maxLevel$ , goes as far as possible at each level, without going past target, descending one level at a time, until reaching the target node. Addition/Removal of nodes makes it difficult to maintain an ideal skip list, in which  $next[i]$  of a node points to a node that is exactly  $2^i$  away from it. Skip lists solve this problem by selecting the number of levels (size of  $next[ ]$ ) of a new node probabilistically. ~~When the size exceeds a threshold, elements are reorganized into an ideal skip list, with a new choice of  $maxLevel$ .~~

```

find(x): // Helper function
// return prev[0..maxLevel] of nodes at which search went down one level, looking for x
p ← head
for i ← maxLevel downto 0 do
    while p.next[i].element < x do
        p ← p.next[i]
    prev[i] ← p
return prev

```

```

chooseLevel(lev): // Choose number of levels for a new node randomly
// Prob(choosing level i) =  $\frac{1}{2}$  Prob(choosing level i - 1)
i ← 0
while i < lev do
    b ← random.nextBoolean()
    if b then i++ else break
return i

```

```

add(x):
prev ← find(x)
if prev[0].next[0].element = x then
    prev[0].next[0].element ← x
else
    lev ← chooseLevel(maxLevel)
    n ← new SkipListEntry(x, lev)
    for i ← 0 to lev do
        n.next[i] ← prev[i].next[i]
        prev[i].next[i] ← n
    size ++

```

```

contains(x):
prev ← find(x)
return prev[0].next[0].element = x ?

```

```

remove(x):
prev ← find(x)
n ← prev[0].next[0]
if n.element ≠ x then
    return null
else
    for i ← 0 to maxLevel do
        if prev[i].next[i] = n then
            prev[i].next[i] ← n.next[i]
        else break
    size --
return n.element

```