

## CS 561, Lecture 11

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### Skip List

- Technically, not a BST, but they implement all of the same operations
- Very elegant randomized data structure, simple to code but analysis is subtle
- They guarantee that, with high probability, all the major operations take  $O(\log n)$  time

1

### Skip List

- A skip list is basically a collection of doubly-linked lists,  $L_1, L_2, \dots, L_x$ , for some integer  $x$
- Each list has a special head and tail node, the keys of these nodes are assumed to be  $-\text{MAXNUM}$  and  $+\text{MAXNUM}$  respectively
- The keys in each list are in sorted order (non-decreasing)

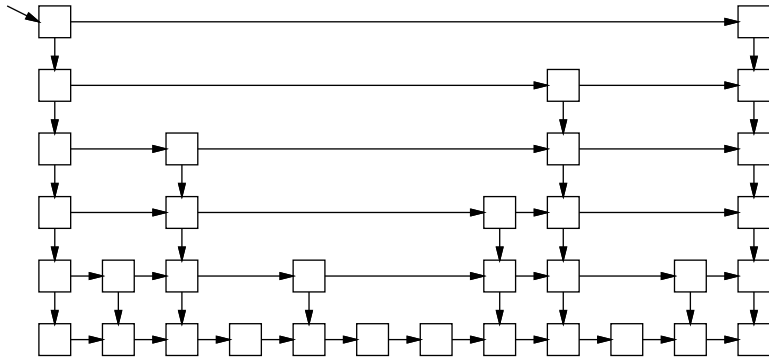
2

### Skip List

- Every node is stored in the bottom list
- For each node in the bottom list, we flip a coin over and over until we get tails. For each heads, we make a duplicate of the node.
- The duplicates are stacked up in levels and the nodes on each level are strung together in sorted linked lists
- Each node  $v$  stores a search key ( $\text{key}(v)$ ), a pointer to its next lower copy ( $\text{down}(v)$ ), and a pointer to the next node in its level ( $\text{right}(v)$ ).

3

## Example



4

## Search

- To do a search for a key,  $x$ , we start at the leftmost node  $L$  in the highest level
- We then scan through each level as far as we can without passing the target value  $x$  and then proceed down to the next level
- The search ends either when we find the key  $x$  or fail to find  $x$  on the lowest level

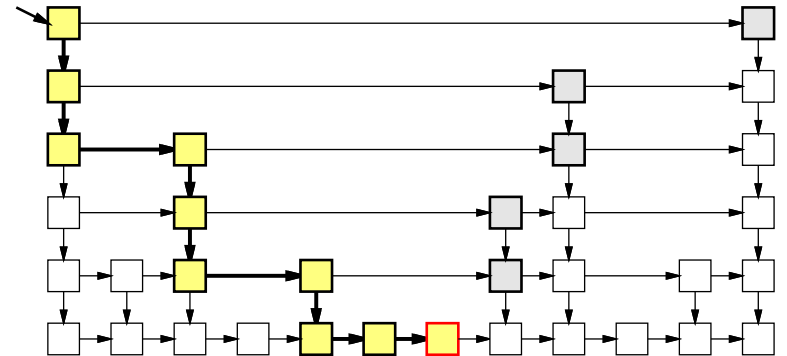
5

## Search

```
SkipListFind(x, L){  
  v = L;  
  while (v != NULL) and (Key(v) != x){  
    if (Key(Right(v)) > x)  
      v = Down(v);  
    else  
      v = Right(v);  
  }  
  return v;  
}
```

6

## Search Example



7

## Insert

$p$  is a constant between 0 and 1, typically  $p = 1/2$ , let `rand()` return a random value between 0 and 1

```
Insert(k){
  First call Search(k), let pLeft be the leftmost elem <= k in L_1
  Insert k in L_1, to the right of pLeft
  i = 2;
  while (rand() <= p){
    insert k in the appropriate place in L_i;
  }
```

8

## Deletion

- Deletion is very simple
- First do a search for the key to be deleted
- Then delete that key from all the lists it appears in from the bottom up, making sure to “zip up” the lists after the deletion

9

## Analysis

- Intuitively, each level of the skip list has about half the number of nodes of the previous level, so we expect the total number of levels to be about  $O(\log n)$
- Similarly, each time we add another level, we cut the search time in half except for a constant overhead
- So after  $O(\log n)$  levels, we would expect a search time of  $O(\log n)$
- We will now formalize these two intuitive observations

10

## Height of Skip List

- For some key,  $i$ , let  $X_i$  be the maximum height of  $i$  in the skip list.
- Q: What is the probability that  $X_i \geq 2 \log n$ ?
- A: If  $p = 1/2$ , we have:

$$\begin{aligned} P(X_i \geq 2 \log n) &= \left(\frac{1}{2}\right)^{2 \log n} \\ &= \frac{1}{(2^{\log n})^2} \\ &= \frac{1}{n^2} \end{aligned}$$

- Thus the probability that a particular key  $i$  achieves height  $2 \log n$  is  $\frac{1}{n^2}$

11

## Height of Skip List

- Q: What is the probability that *any* key achieves height  $2 \log n$ ?
- A: We want

$$P(X_1 \geq 2 \log n \text{ or } X_2 \geq 2 \log n \text{ or } \dots \text{ or } X_n \geq 2 \log n)$$

- By a Union Bound, this probability is no more than

$$P(X_1 \geq k \log n) + P(X_2 \geq k \log n) + \dots + P(X_n \geq k \log n)$$

- Which equals:

$$\sum_{i=1}^n \frac{1}{n^2} = \frac{n}{n^2} = 1/n$$

12

## Height of Skip List

- This probability gets small as  $n$  gets large
- In particular, the probability of having a skip list of size exceeding  $2 \log n$  is  $o(1)$
- If an event occurs with probability  $1 - o(1)$ , we say that it occurs *with high probability*
- *Key Point:* The height of a skip list is  $O(\log n)$  with high probability.

13

## In-Class Exercise Trick

A trick for computing expectations of discrete positive random variables:

- Let  $X$  be a discrete r.v., that takes on values from 1 to  $n$

$$E(X) = \sum_{i=1}^n P(X \geq i)$$

14

## Why?

$$\begin{aligned} \sum_{i=1}^n P(X \geq i) &= P(X = 1) + P(X = 2) + P(X = 3) + \dots \\ &+ P(X = 2) + P(X = 3) + P(X = 4) + \dots \\ &+ P(X = 3) + P(X = 4) + P(X = 5) + \dots \\ &+ \dots \\ &= 1 * P(X = 1) + 2 * P(X = 2) + 3 * P(X = 3) + \dots \\ &= E(X) \end{aligned}$$

15

## In-Class Exercise

Q: How much memory do we expect a skip list to use up?

- Let  $X_i$  be the number of lists that element  $i$  is inserted in.
- Q: What is  $P(X_i \geq 1)$ ,  $P(X_i \geq 2)$ ,  $P(X_i \geq 3)$ ?
- Q: What is  $P(X_i \geq k)$  for general  $k$ ?
- Q: What is  $E(X_i)$ ?
- Q: Let  $X = \sum_{i=1}^n X_i$ . What is  $E(X)$ ?

16

## Search Time

- Its easier to analyze the search time if we imagine running the search backwards
- Imagine that we start at the found node  $v$  in the bottommost list and we trace the path backwards to the top leftmost sentinel,  $L$
- This will give us the length of the search path from  $L$  to  $v$  which is the time required to do the search

17

## Backwards Search

```
SLFback(v){
  while (v != L){
    if (Up(v) != NIL)
      v = Up(v);
    else
      v = Left(v);
  }
}
```

18

## Backward Search

- For every node  $v$  in the skip list  $Up(v)$  exists with probability  $1/2$ . So for purposes of analysis, SLFBack is the same as the following algorithm:

```
FlipWalk(v){
  while (v != L){
    if (COINFLIP == HEADS)
      v = Up(v);
    else
      v = Left(v);
  }
}
```

19

## Analysis

- For this algorithm, the expected number of heads is exactly the same as the expected number of tails
- Thus the expected run time of the algorithm is twice the expected number of upward jumps
- Since we already know that the number of upward jumps is  $O(\log n)$  with high probability, we can conclude that the expected search time is  $O(\log n)$