

# Hashing With Probing

## Data Structures

- The dictionary problem: maintain a dynamic set  $S$  of **keys** (with associated data)
  - Insert( $x$ ) : add  $x$  to  $S$
  - Delete( $x$ ) : delete  $x$  from  $S$
  - Lookup( $x$ ) : is  $x \in S$ ? (Return ptr. to associated data if yes.)
- Hashing w/ Chaining**
  - $O(1)$  time in expectation, with simple hash functions.
- Cuckoo Hashing**
  - $O(1)$  worst case per delete, lookup. Requires somewhat stronger hash functions.
- Hashing w/ Linear Probing**
  - $O(1)$  in expectation, but much more **cache-efficient**.

## Cache-efficiency

- Cache misses (not memory accesses) is usually the best proxy for running time in practice.
- Data automatically moved from main memory to cache (L1/L2/L3) in contiguous blocks of size  $B$ .



## Hashing with Linear Probing

- Array  $A[0..N-1]$
- Hash function  $h: [u] \rightarrow [N]$ . (Assume Ideal Hash Model...)
- All array cells initially NULL.
- Insert( $x$ ) : Find first index  $i$  in the sequence  $h(x), h(x) + 1, h(x) + 2, \dots, h(x) + N - 1$  (all mod  $N$ ) such that  $A[i] = \text{NULL}$ . Set  $A[i] := x$ .
- Lookup( $x$ ) : Find first index  $i$  in the sequence  $h(x), h(x) + 1, h(x) + 2, \dots, h(x) + N - 1$  (all mod  $N$ ) such that  $A[i] = \text{NULL}$ . Return "true" if  $x$  appears in  $A[h(x)..i-1]$  and "false" otherwise.
- Assume at most  $n$  Inserts,  $N = 2n$ .

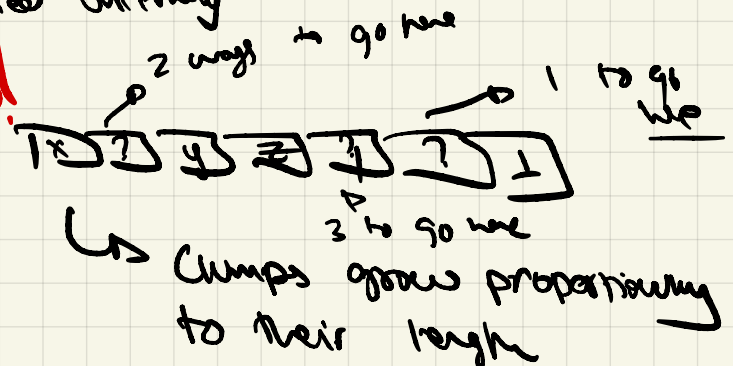
add a sentinel  
key @ which  
is null for insert  
but not lookup  
Cost rehash  
keys after  
but before  
next 1-null

ignore  
deletes

Can we assume that cells are occupied uniformly across  $\binom{N}{n}$  possibilities? **NO!**

Coincidence skewed towards clump  
↳ long clumps get larger

↳ merging clump is quite likely





- A "run"  $J$  is a contiguous interval of keys. It exists if:
  - (1) exactly  $|J|$  keys are hashed to  $J$ .
  - (2) Nothing is hashed to cells on either side of  $J$ .
  - (3) At least  $j$  keys hashed to first  $j$  cells of  $J$ .
- Total insertion cost for a run  $J$  is at most  $|J|^2$ .

### Analysis of Linear Probing

- Def.**  $I_{i,k}$  is the indicator for the event that a run of length  $k$  starts at  $A[i]$ , i.e.,  $A[i..i+k-1]$  is a run.

$$\text{total insertion time} \leq \sum_{i=0}^{2n-1} \sum_{k=1}^n I_{i,k} \cdot k^2$$

$$E[\text{total insertion time}] \leq \sum_{i=0}^{2n-1} \sum_{k=1}^n E[I_{i,k}] \cdot k^2$$

- $p_k = E[I_{i,k}] = \Pr(J = A[i..i+k-1] \text{ is a run})$ 
  - $\leq (\# \text{ ways to choose } k \text{ keys})$
  - $\times \Pr(\text{those } k \text{ keys hashed to } J)$
  - $\times \Pr(\text{remaining } n-k \text{ keys not hashed to } J)$

$$= \binom{n}{k} \cdot \left(\frac{k}{2n}\right)^k \left(\frac{2n-k}{2n}\right)^{n-k}$$

binomially

this is an upper bound

- $\binom{n}{k} = \frac{n!}{k!(n-k)!} \leq \frac{n^n}{k^k (n-k)^{n-k}}$  (follows from Stirling's approx.)

- $p_k \leq \frac{n^n}{k^k (n-k)^{n-k}} \cdot \frac{k^k}{(2n)^k} \cdot \frac{(2n-k)^{n-k}}{(2n)^{n-k}}$ 

$$= \frac{n^n}{k^k (n-k)^{n-k}} \cdot \frac{k^k}{2^k n^k} \cdot \frac{(n-k/2)^{n-k}}{n^{n-k}}$$

$$= \left(\frac{1}{2}\right)^k \cdot \left(1 + \frac{k/2}{n-k}\right)^{n-k}$$

$$\leq \left(\frac{1}{2}\right)^k e^{\frac{k}{2}} = \left(\frac{\sqrt{e}}{2}\right)^k < 0.83^k$$

decays from as  $\frac{\sqrt{e}}{2} < 1$

trying to bound time for all  $n$  inserts

how much did this contribute

well at worst  $\frac{|J|^2}{2}$

they all hashed to the same first value

now, let's see prob of seeing this run.  
Upper bound by this

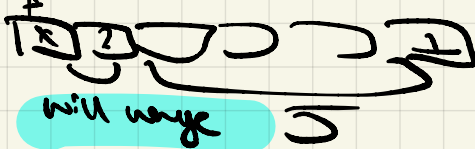
It may show  
5-wise way

argues  $n$ -wise independence

can show  $k$ -wise suff  
if  $k = \log n$

as we don't consider not looking to end of array

this case



- $E[\text{total insertion time}] \leq \sum_{i=0}^{2n-1} \sum_{k=1}^n E[I_{i,k}] \cdot k^2$

$$\leq \sum_{i=0}^{2n-1} \sum_{k=1}^n \left(\frac{\sqrt{e}}{2}\right)^k \cdot k^2$$

$$= \sum_{i=0}^{2n-1} O(1) = O(n)$$

inserting  $n$  elts  
 $\Rightarrow$  one insertion time cost