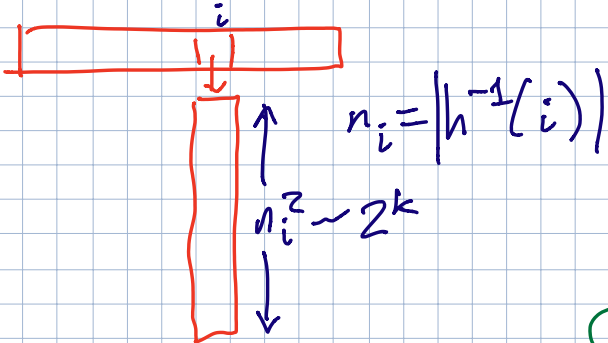


# algorithms. wtf

## Hashing

Chained:



$O(1)$  worst-case time

$O(n)$  expected space

assuming universal hashing

$$\Pr[h(x) = h(y)] \leq \frac{O(1)}{m}$$

## Open addressing



$h_3(x)$

$h_1(x)$

$h_2(x)$

$h_4(x)$

Probe sequence for  $x$

$h_1(x), h_2(x), h_3(x), \dots$

Lookup(x):

for  $i \leftarrow 1$  to  $m$

if  $T[h_i(x)] = x$

TRUE

else if  $T[h_i(x)] = \emptyset$

FALSE

~~Ideal:~~  
 For all  $x$ :  
 $(h_1(x), h_2(x), \dots)$  is a <sup>random</sup> perm of  $(0, 1, \dots, m-1)$   
 not possible

$\Rightarrow E[\text{time for a search}] = O\left(\frac{m}{m-n}\right)$

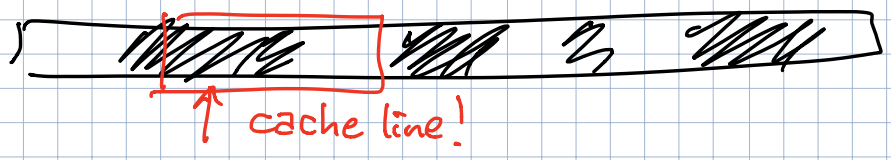
$n$  items  
 $m$  slots

$m-n$  empty

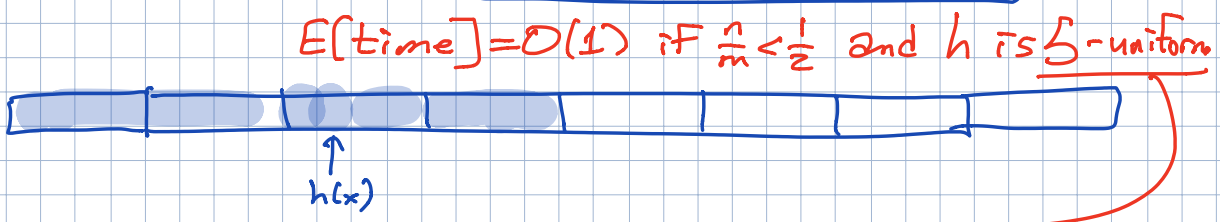
$\Pr[\text{empty}] = \frac{m-n}{m} = 1 - \frac{n}{m}$

$E[\# \text{ probes}] = \frac{m}{m-n}$

Linear probing:  $h_i(x) = (h(x) + i) \bmod m$   
 unfortunate/unintuitive clumping

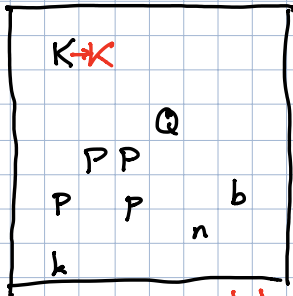


Binary probing:  $m = 2^k$   
 $h_i(x) = h(x) \oplus i$



$\rightarrow \Pr[h(a)=i \ h(b)=j \ h(c)=k \ h(d)=l \ h(e)=l'] \leq \frac{1}{m^5}$

# ZOBORIST HASHING



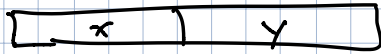
$$h = T[k \oplus b_7] \oplus T[k \oplus b_1] \oplus \dots$$

$T[\dots]$  Filled with random #s

$$h' = h \oplus T[k \oplus b_7] \oplus T[k \oplus c_7]$$

Carter Wegman '76 Tabulation hashing

$$\mathcal{U} = [2^w] \quad (x, y) \in \mathcal{U} \quad x \in [2^{w/2}] \quad y \in [2^{w/2}]$$



$A[0..2^{w/2}-1]$   
 $B[0..2^{w/2}-1]$

} ideal random integers

$$h(x, y) = (A[x] \oplus B[y]) \bmod m$$

↑ random
↑ random



$$h(x_1 \dots x_8) = \bigoplus_{i=1}^8 A_i[x_i]$$

3-uniform  
not  
4-uniform

$$h(x, y) \oplus h(x', y) \oplus h(x, y') \oplus h(x', y') = 0$$

But almost ideal random

[Patrascu, Thorup 05]

Good enough for linear probing

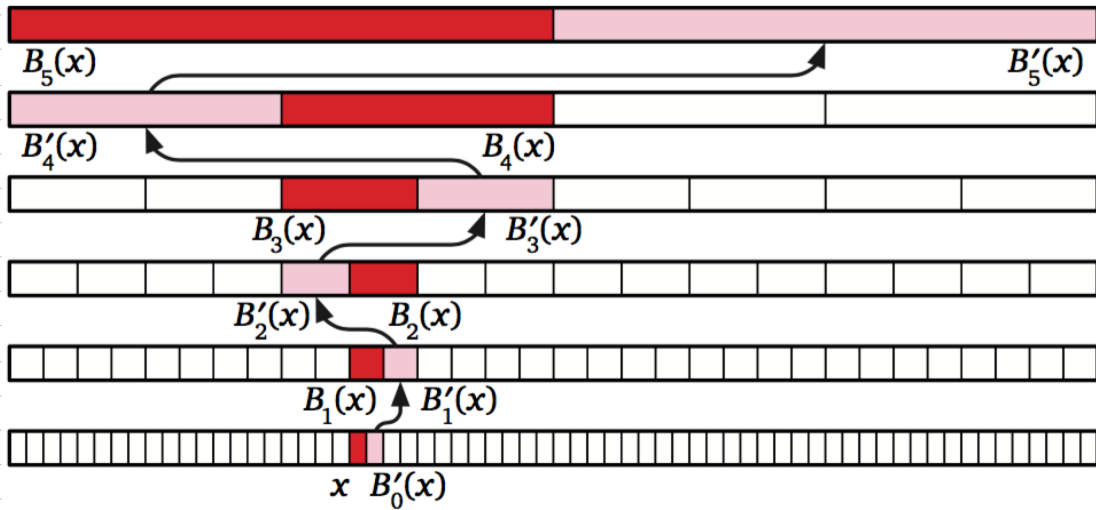
## Modified Tab Hashing [Thorup Zhang 12]

$$h(x,y) = A[x] \oplus B[y] \oplus C[x+y]$$

S-uniform!

k-uniform  $\Rightarrow$   $\sim c \cdot k$  table lookups  
c chunks  $\Rightarrow$

---



ancestors

$B_k(x)$  = block of size  $2^k$  containing  $h(x)$

uncles

$B'_k(x)$  = sibling of  $B_k(x) = B_{k+1}(x) \setminus B_k(x)$

LOOSEBINARYPROBE(x):

if  $H[h(x)] = x$

return TRUE

if  $H[h(x)]$  is empty

return FALSE

$first \leftarrow$  DUNNO

for  $k \leftarrow 0$  to  $\ell - 1$

for each index  $j \in B'_k(x)$  in arbitrary order

if  $H[j] = x$

$first \leftarrow$  TRUE

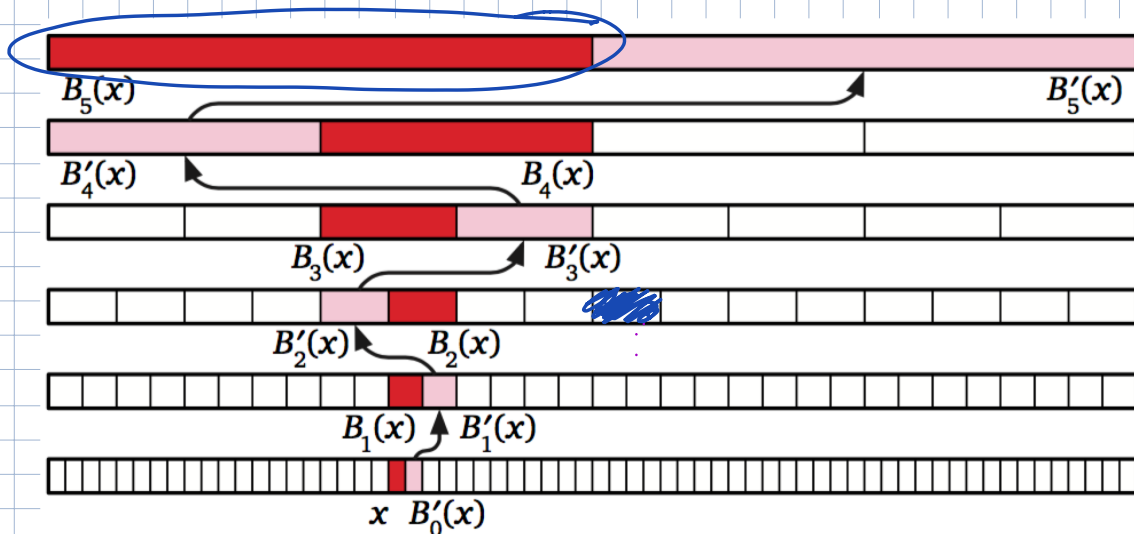
if  $H[j]$  is empty

$first \leftarrow$  FALSE

if  $first \neq$  DUNNO

return  $first$

$$E(\text{time}) \leq O(1) + \sum_{k=1}^{\ell-1} O(2^k) \cdot \Pr[B'_k \text{ is full}]$$



$B_k$  is full  $\Leftrightarrow B_k$  is popular  $\leftarrow 2^k$  items hashed here

or one of  $B_k$ 's uncles is ~~full~~ popular

Need  $\Pr[B'_k(x) \text{ is popular}]$

Assume  $n = \frac{m}{2}$

$$E[\# \text{items hash into } B_k] = 2^{k-1}$$

$$\Pr[\# \text{items} \geq 2 \cdot E[\# \text{items}]]$$

5-indep  $\Rightarrow$  4th moment inequality

$$\Pr[\text{popular}] \leq O(4^{-k})$$

$$\begin{aligned} E[\text{time}] &= \sum_k O(2^k) \cdot \Pr[B_k \text{ is popular}] \\ &= \sum_k O(2^k) \cdot O(4^{-k}) = \sum_k O(2^{-k}) \\ &= O(1) \end{aligned}$$

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Cuckoo hashing

A D G C F E B

x is stored at  $T[h(x)]$  or  $T[h'(x)]$

use tabulation hashing