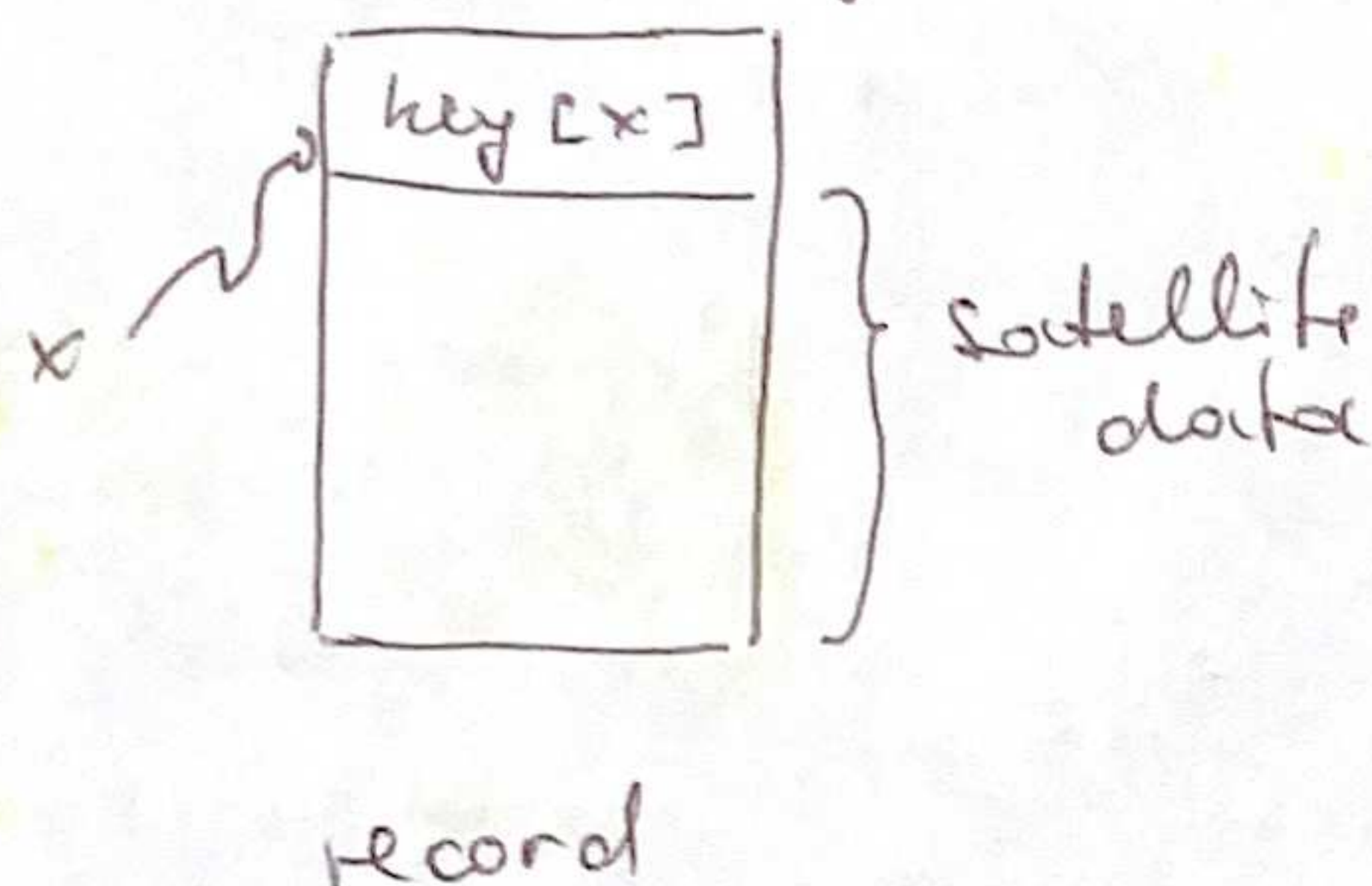


Symbol-table problem (compilers)

Table S holding records



static set is only lookup, etc...

Operations:

- insert(S, x): $S \leftarrow S \cup \{x\}$
 - delete(S, x): $S \leftarrow S - \{x\}$
 - search(S, k): return x s.t. $key[x] = k$ or nil if no such x
- dynamic set

Direct access table

Suppose keys are drawn from $u = \{0, 1, \dots, m-1\}$

Assume keys are distinct

Set up array $T[0 \dots m-1]$ to represent dyn. set S

$$T[k] = \begin{cases} x & \text{if } x \in S \text{ and } key[x] = k \\ \text{nil} & \text{otherwise} \end{cases}$$

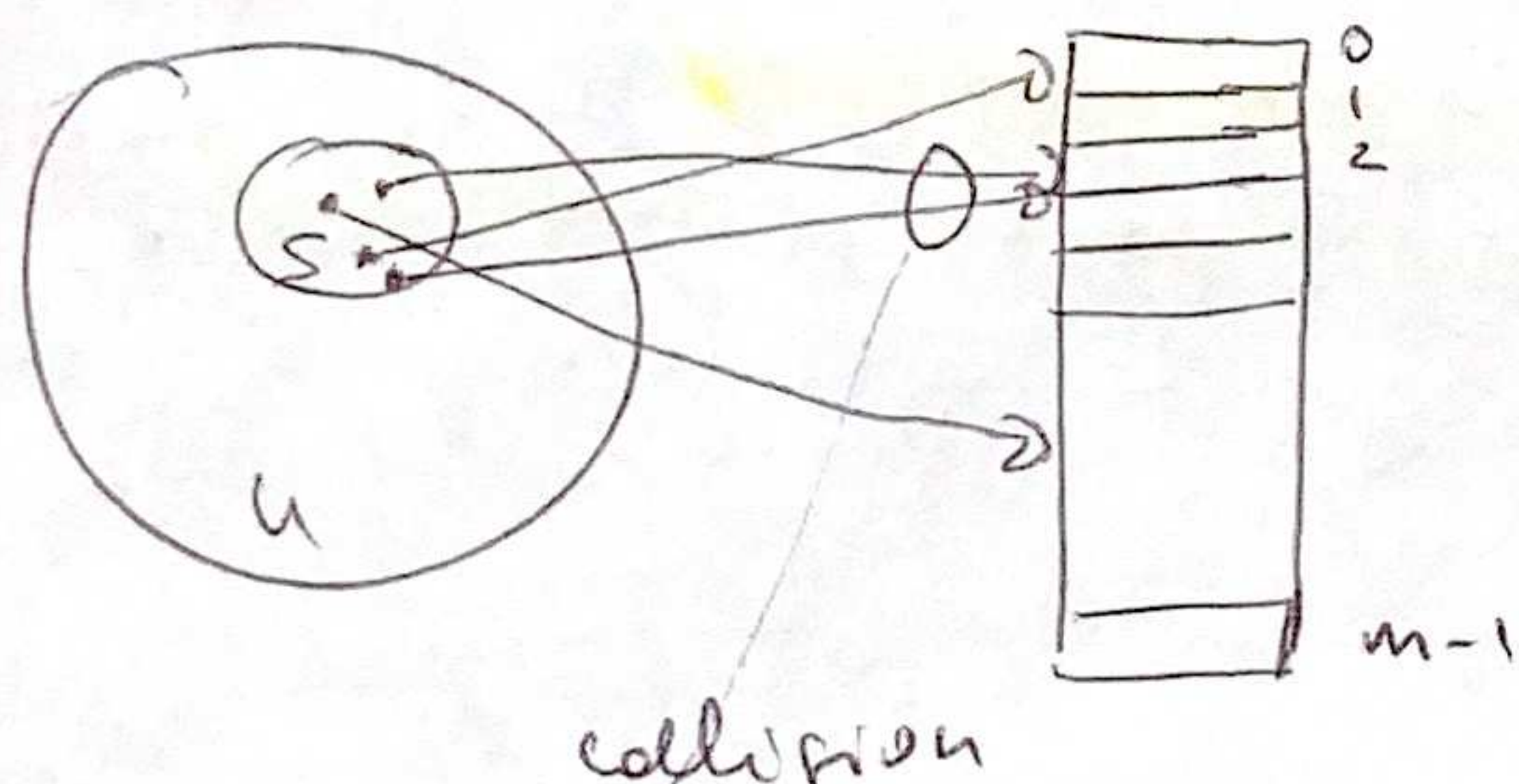
Ops take $\Theta(1)$ time

e.g. 64 bit keys
drawn,
need a table of
size 2^{64}

need hashing

Hashing

Hash function h maps keys "randomly" into slots of table T .



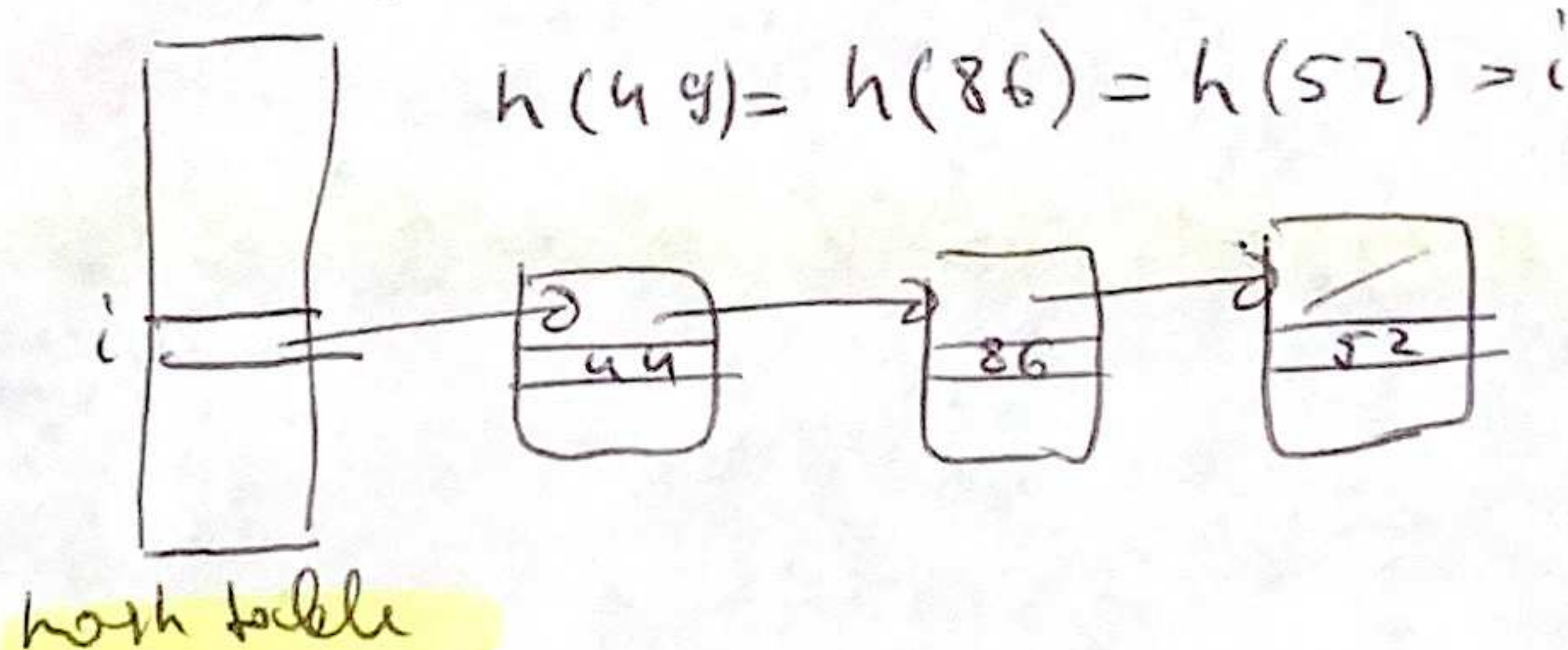
when a record to be inserted maps to an already occupied slot, a collision occurs.

Resolving collisions by chaining

idea: link records in same slot into list

Analysis

Worst case: every key hashes to the same slot. \rightarrow long link list
access takes $\Theta(n)$ time if $|S| = n$



Average case

assumption of simple uniform hashing

- each key is equally likely to be hashed to any slot in T , independent where other keys are hashed

of Binomial

→ Expected unsuccessful search time : $\Theta(1 + \alpha)$

also for
successful
search
 $\Theta(1 + d)$

Expected search time = $\Theta(1)$

if $d = O(1)$, i.e. $n = O(m)$

cost of
work &
accn to slt

① cost of lost search

Choosing a work function:

- Should distribute keys uniformly into slots
- Regularity in key distribution should not affect uniformity

Division method

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

← does not have to be
eq. to size of table
can be around the size (len)

- don't pick m with small divisor d

Ex. $d=2$ and all keys even
 \Rightarrow odd slots never used

even \nmid mod even \nmid as even

Ex $m = 2^r \Rightarrow$ hash does not depend on all bits of k

$k = 1011\ 00011 \overset{2^6}{\underbrace{011010}}_{h(k)} \quad r=6 \quad m=2^6$

$h(k)$
h does not depend on other bits

Pick $m =$ prime not too close to power of 2 or 10

common bases with regularities in the world

good
heuristic

however, the division method is compute-intensive.

Multiplication method

number of slots $m = 2^r$, computer has w -bit words

$$h(k) = (A \cdot k \bmod 2^w) \uparrow \text{rsh}(w-r)$$

fixed odd integer
 $2^{w-1} < A < 2^w$

↑
right shifted by
bitwise

- Don't pick A too close to 2^{w-1} or 2^w
- Fast method: mult. mod 2^w faster than division
rsh vs fast

Ex: $m = 8 = 2^3$, $w = 7$
 full word
 $1011001 = A$
 $1101011 = k$

10010100110011
 right-order two-word product
 bits ignored with mod 2

0110011
 $h(k)$ rsh removes 4 bits

Resolving collisions by open addressing

- No storage for links
 - Probe table systematically until an empty slot is found (hash function after hash function)
 - $h: U \times \{0, 1, \dots, m-1\} \rightarrow \{0, 1, \dots, m-1\}$
 universe of keys probe # index of a hash function
 - Probe seq. should be permutation
 - Table may fill up, $n \leq m$
 - Deletion is difficult
- given a key, the sequence of slots hit, no repeating

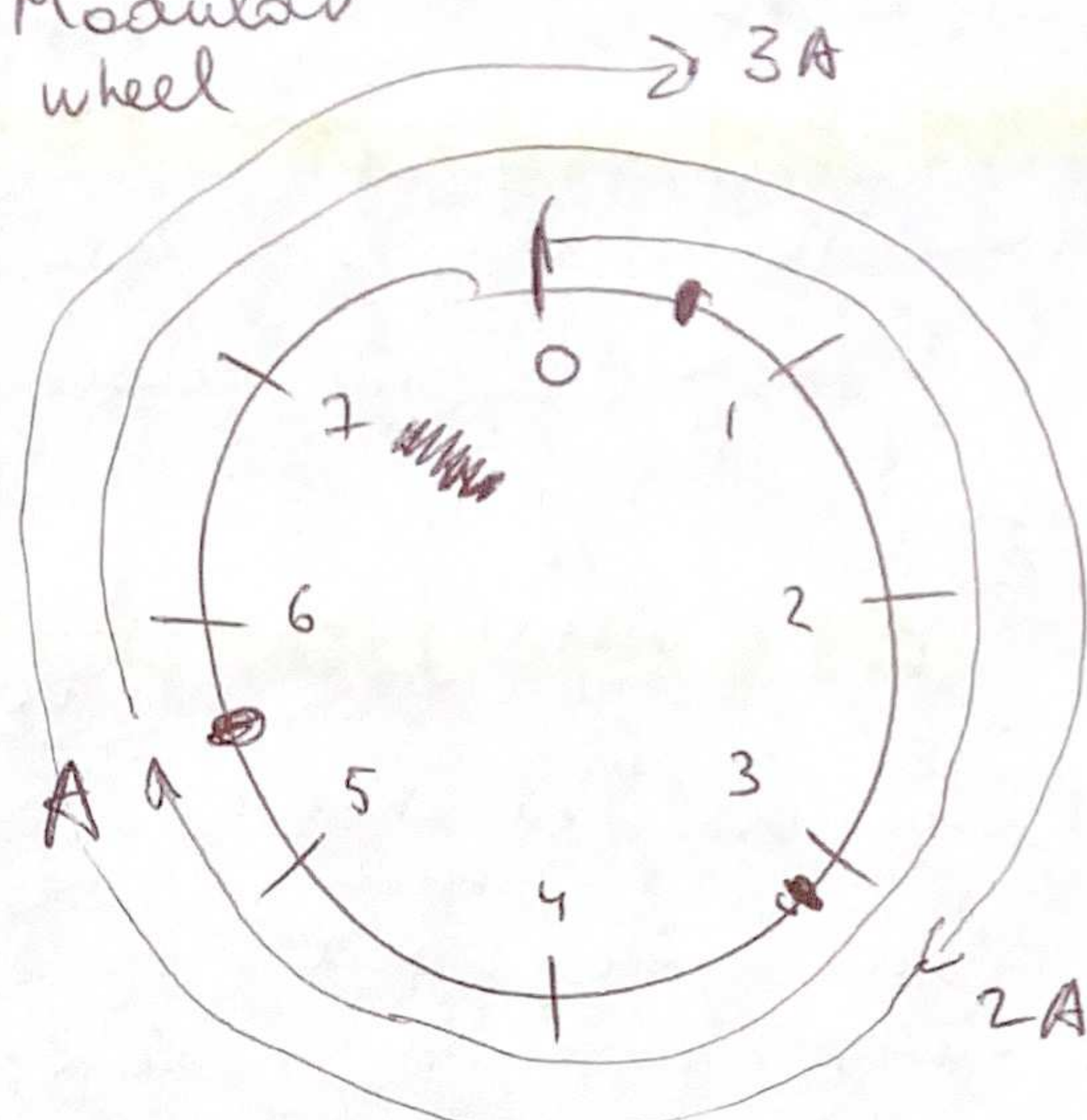
Ex: Insert $k = 496$

0. Probe $h(496, 0)$	586
1. Probe $h(496, 1)$	133
2. Probe $h(496, 2)$	204
	481

Probing strategies

- Linear - $h(k, i) = (h(k, 0) + i) \bmod m$
 "primary clustering" - long runs of filled slots
- Double hashing - $h(k, i) = (h_1(k) + i \cdot h_2(k)) \bmod m$
 excellent method, usually pick $m = 2^r$ and $h_2(k)$ odd
 compute $h_2(k)$ upfront; $m = 2^r$ with multiplication method

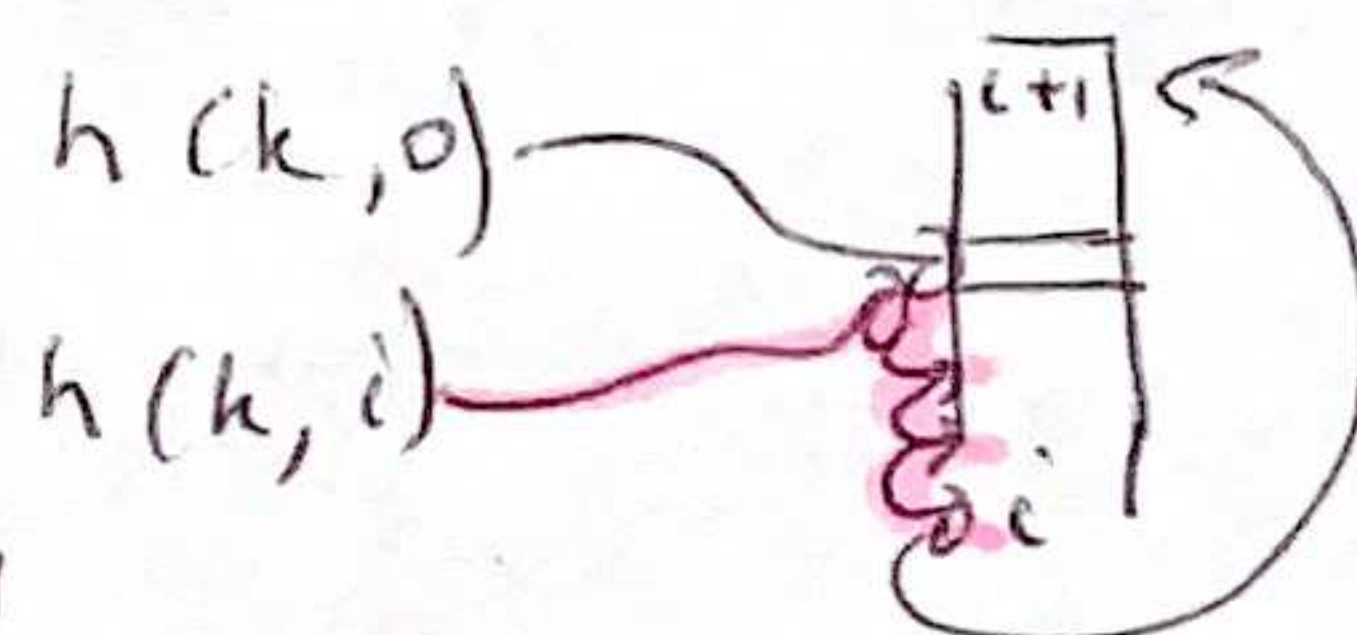
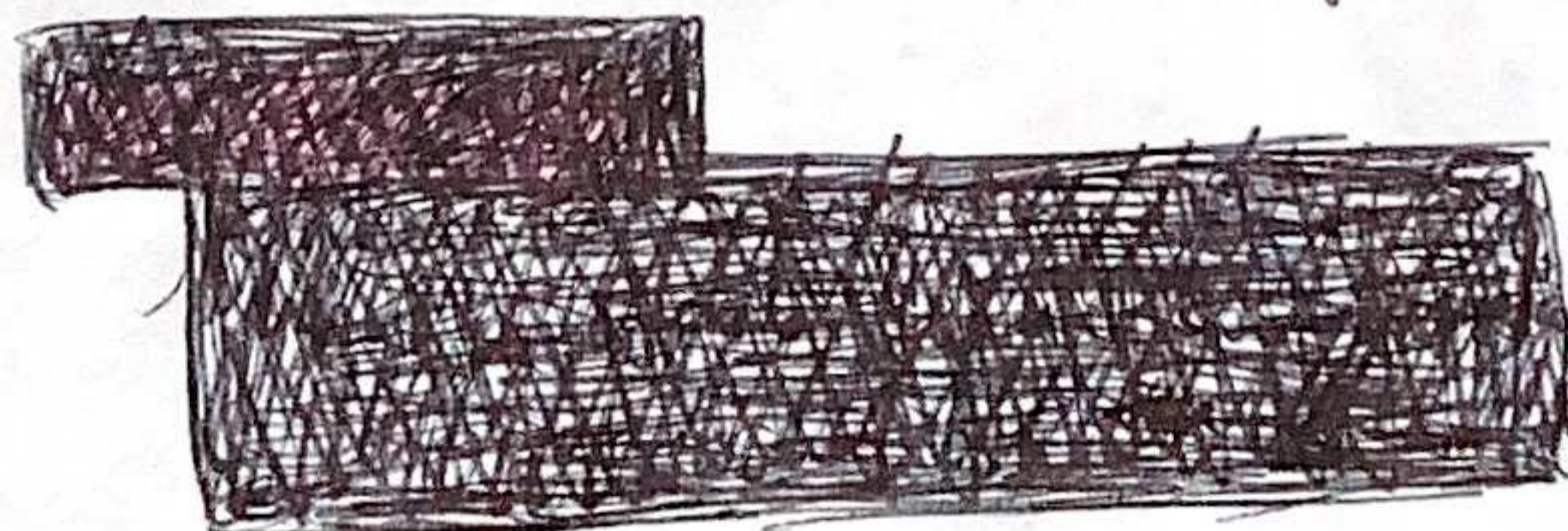
Modular wheel



k spins the wheel...
 to heuristic

Search - same probe sequence

- successful - And record with key
- unsuccessful - find nil



Analysis of open addressing ← stronger than simple uniform hashing

Assumption of uniform hashing:

each key is equally likely to have any one of the $m!$ perms as its probe seq., indep. of other keys

Theorem

$$E[\# \text{ probes}] \leq \frac{1}{1-\alpha} \text{ if } \alpha < 1 \text{ (i.e. } n < m)$$

Pf. (unsuccessful search):

1. probe always necessary

with prob. n/m collision \Rightarrow 2. probe is necessary

2. probe prob. of collision $\frac{n-1}{m-1} \Rightarrow$ 3. probe is necessary

3. probe prob. of collision $\frac{n-2}{m-2} \dots$

Note: $\frac{n-i}{m-i} < \frac{n}{m} = \alpha$ for $i = 1, 2, \dots, n-1$, assumption $n < m$ (necessary for open addressing)

$$E[\# \text{ probes}] = 1 + \frac{n}{m} \left(1 + \left(\frac{n-1}{m-1} \right) \left(1 + \frac{n-2}{m-2} \left(\dots \left(1 + \frac{1}{m-n} \right) \dots \right) \right) \right)$$

$$\leq 1 + \alpha (1 + \alpha (1 + \alpha (\dots 1 + \alpha) \dots))$$

$$\leq 1 + \alpha + \alpha^2 + \alpha^3 + \dots$$

$$= \sum_{i=0}^{\infty} \alpha^i = \frac{1}{1-\alpha}$$

$$1 + \frac{n}{m} + \frac{n}{m} \left(\frac{n-1}{m-1} \right) + \frac{n}{m} \left(\frac{n-1}{m-1} \right) \left(\frac{n-2}{m-2} \right) \dots$$

$\alpha < 1$ const $\Rightarrow O(1)$ probes in expectation

- Table $\alpha = \frac{1}{2}$ 50% full $\Rightarrow \leq 2$ probes in expectation

- Table 90% full $\Rightarrow \leq 10$ probes in expectation

const goes up
need to keep α low

\Rightarrow keep the table not full