

# lecture 3

## hashing, hash tables

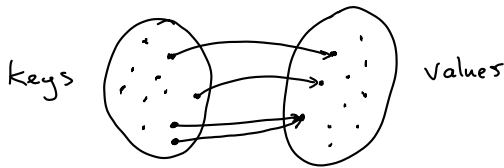
### Background Resources

- my COMP 250 lectures 31, 32

### Mix of Background + New Material

- coursera
  - Sedgwick Algorithms 1 week 6
    - <https://class.coursera.org/algs4part1->
    - <https://class.coursera.org/algs4part1->
    - <https://class.coursera.org/algs4part1-003/lecture/55>
  - Roughgarden Algorithms 1 week 6
    - <https://class.coursera.org/algo-004/lecture>
- Cormen Leiserson Rivest (CLR) Ch. 12

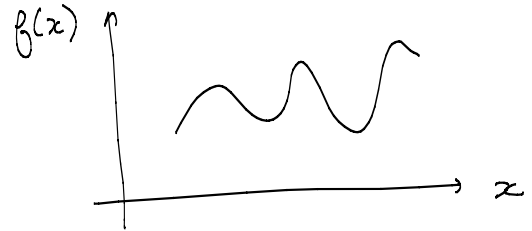
### Map



A map is a set of (key, value) pairs.

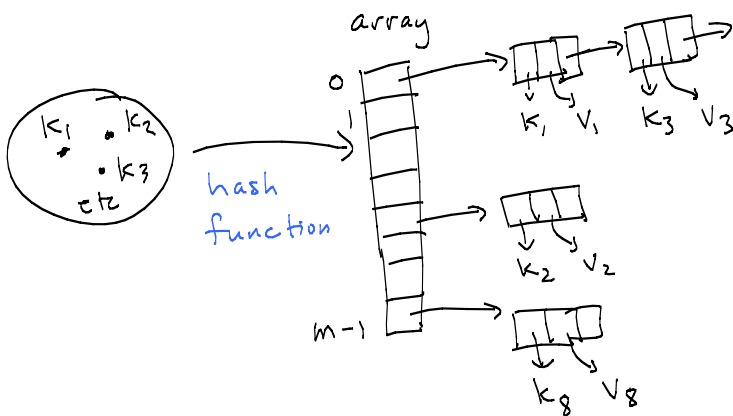
Each key maps to at most one value.

e.g.  $\{ (x, f(x)) \}$



This is also a map. ("function" = "map")  
But we will NOT be talking about continuous functions/maps.

### Hash Map (Hash function + Hash Tables)



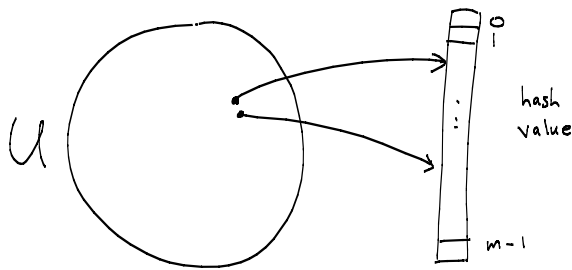
### Hash Function

$$h: U \rightarrow \{0, 1, \dots, m-1\}$$

↑ universe of possible keys

e.g.  $U$  might be the set of all finite length strings  
(This set has infinite size.)

## "Hash" - mixing

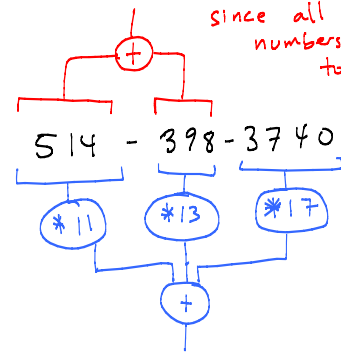


"Nearby / similar" keys in  $U$  should map to different values.

## Example of good/bad hash function

### Bad hash function

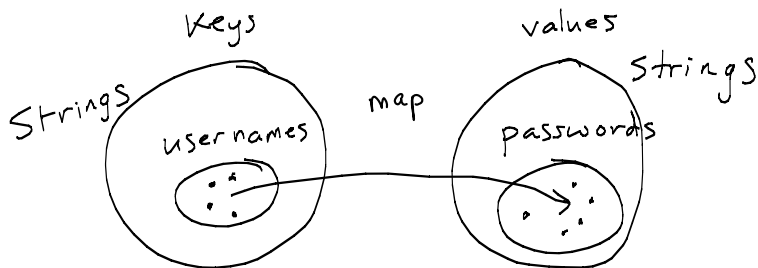
since all McGill phone numbers would hash to same value



$U$  = set of 10 digit telephone numbers

### Good hash function

## Example where hashing is used: Password Authentication



{ (usernames, passwords) } map  
- stored as a file on some webserver

To login, enter username and password. Server verifies that password entered matches user's password in file.

Problem: hacker could steal the file

Solution: the webserver hashes password and stores map (username, hash(password)) instead of { (username, password) }.

Q: What happens when you log in?

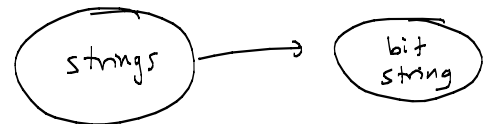
You enter (username, password)  
The "system" does what?

A:

It computes hash(password),

"throws away" your real password, and verifies that the hashed password matches the one in the password file.

There exist "standard" algorithms for hashing passwords and other private text ("cryptographic hashing")

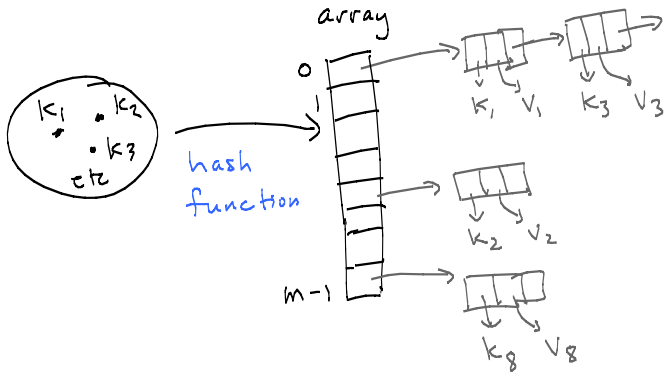


e.g. MD-5 (128 bits)  
SHA-1 (256 bits)

<http://www.md5.cz/>

Details of these algorithms are not worth covering in COMP 251 (complicated "bit mixing" operations).

# Hash Functions for Hash Tables

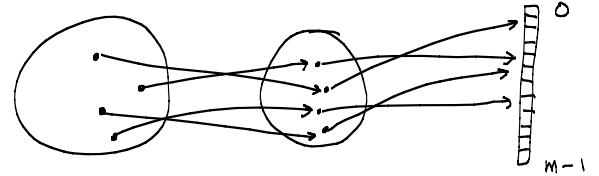


# Hash functions for hash tables: two steps

hash coding      Compression

$$h: U \rightarrow \{\text{integers}\} \rightarrow \{0, 1, \dots, m-1\}$$

Universe of keys      "hash codes"      "hash values"



## Hash function: two steps

$$h: U \rightarrow \{0, \dots, m-1\}$$

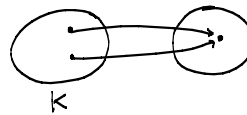
$$h(\text{key}) = \text{Compression}(\text{hashCode}(\text{key}))$$

↑  
Composition of maps

hash coding

$$h: K \rightarrow \{\text{integers}\}$$

In Java, every class has a `hashCode()` method which returns an "int": 32 bits.



It can happen (but its rare) that two keys e.g. Strings  $s_1, s_2$  have the same hashCode.

hash Coding      Compression

$$h: K \rightarrow \{\text{integers}\} \rightarrow \{0, 1, \dots, m-1\}$$

hash codes      hash values

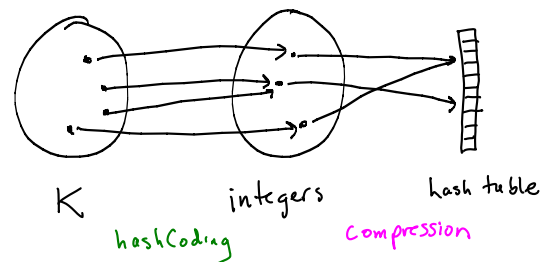
It often happens that compression causes two hash codes to map to the same value.

hash code	hashCode % m (m=7)
41	6
16	2
25	4
21	0
36	1
35	3
53	4

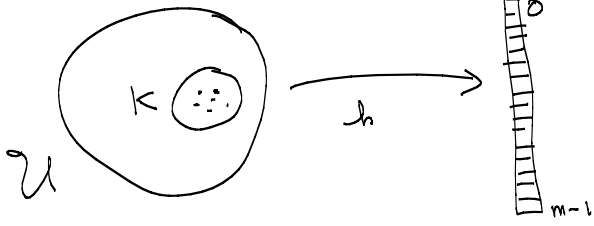
## Collisions

Hash function maps two keys to the same index in the hash table

- either
- two keys have same hash code
  - two keys have different hash codes but are compressed to same hash value



[Exercise: if you have some background in probability]



If there are  $|K|$  randomly chosen keys, and  $m$  "buckets" in the table, what is the probability of a collision?

### "Birthday Problem"

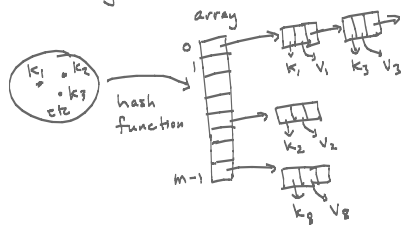


Given a set of (randomly chosen)  $n$  people, what is the probability that at least one pair of them has the same birthday? e.g. for  $n=23$ , probability  $\approx 0.5$  is 50% chance!

The point: collisions happen alot.

### Hash Table Data Structures

• open hashing - "linear chaining" (COMP 250)

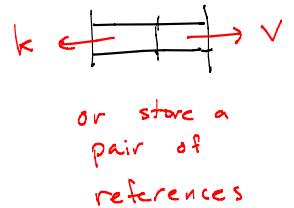


• closed hashing - probing (COMP 251)  
 Sometimes called "open addressing"

### Closed Hashing

At most one (key, value) is stored per array slot. No linked list overhead, no dynamic memory allocation!

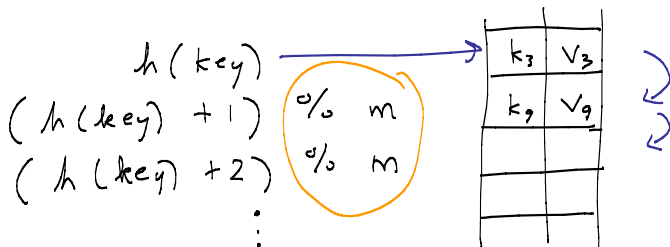
K	V
$k_1$	$v_1$
$k_6$	$v_6$
$k_3$	$v_3$



use two arrays

### Linear Probing

If there is a collision, then check next entry in table:



What is this for?

### Example. ( $m=10$ )

key	$h(key)$
$k_1$	6
$k_2$	2
$k_3$	1
$k_4$	3
$k_5$	1

0		
1	$k_3$	$v_3$
2	$k_2$	$v_2$
3	$k_4$	$v_4$
4	$k_5$	$v_5$
5		
6	$k_1$	$v_1$
7		
8		
9		

## Linear Probing and Clustering

Consider some empty slot in the table.

Q: What is the probability that the next  $\text{put}(\text{key}, \text{value})$  will be to that slot?

A:  $\frac{l+1}{m}$  where the  $l$  previous slots are occupied.

$k_3$	$v_3$
$k_2$	$v_2$
$k_4$	$v_4$
$k_5$	$v_5$
$k_1$	$v_1$

## Linear Probing and Clustering

Consider some empty slot in the table.

Q: What is the probability that the next  $\text{put}(\text{key}, \text{value})$  will be to that slot?

A:  $\frac{l+1}{m}$  where the  $l$  previous slots are occupied.

Bigger clusters grow faster!

$k_3$	$v_3$
$k_2$	$v_2$
$k_4$	$v_4$
$k_5$	$v_5$
$k_1$	$v_1$

## More general probing method

$h_0(\text{key})$   
 $h_1(\text{key}) \% m$   
 $h_2(\text{key}) \% m$   
 $\vdots$   
 $h_{m-1}(\text{key}) \% m$

} sequence of hash functions

For linear probing,

$$h_i(\text{key}) = h_0(\text{key}) + i$$

## Quadratic Probing

$h_0(\text{key}) = h(\text{key})$   
 $h_1(\text{key}) = h(\text{key}) + 1 \% m$   
 $h_2(\text{key}) = h(\text{key}) + 2^2 \% m$   
 $h_3(\text{key}) = h(\text{key}) + 3^2$   
 $\vdots$   
 $h_i(\text{key}) = h(\text{key}) + i^2$

Idea: by using different step sizes, we avoid clustering.

We also want  $h_0(\text{key}), h_1(\text{key}), h_2(\text{key}), \dots$  to map to different slots (no "self collisions")

- Linear probing ensures this, but suffers from clustering 😞
- Quadratic probing ensure this up to  $h_i()$ , where  $i = \sqrt{m}$ . Why?

What about for larger values of  $i$ ?

For quadratic probing, under what conditions does

$$h_i(\text{key}) \% m = h_j(\text{key}) \% m ?$$

Exercise: show the following

$$(h_0(\text{key}) + i^2) \% m = (h_0(\text{key}) + j^2) \% m$$

$$\Leftrightarrow (i^2 - j^2) \% m = 0$$

"if and only if"

$$(i^2 - j^2) \% m = 0$$

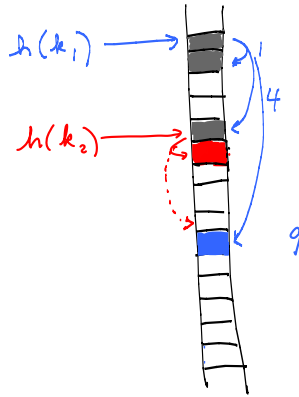
$$\Leftrightarrow (i-j)(i+j) \% m = 0$$

$$\Leftrightarrow (i-j)(i+j) = cm \text{ for some integer } c.$$

Exercise (easy with MATH 240)

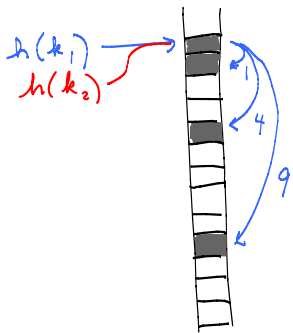
If we choose  $m$  to be a prime number and we require  $i$  and  $j$  are less than  $\frac{m}{2}$  then the above equations are true if and only if  $i=j$ .

## Quadratic Probing



When  $h_0(k_2) \neq h_0(k_1)$  the probe paths tend to land in different slots. (Collisions only rarely occur.)

## Quadratic Probing



When  $h_0(k_2) = h_0(k_1)$

the probe paths land in exactly the same slots.

(Collisions can easily occur.)

## Another common approach: Double hashing

Use two hash functions  $h(), g()$ .

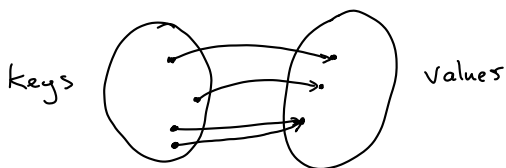
probe sequence

$$h_i(\text{key}) = h(\text{key}) + i \cdot \overbrace{g(\text{key})}^{\text{step size}}$$

for  $i = 0, 1, \dots, m-1$ .

Choose  $h(), g()$  such that different keys tend to have different probe sequences. (unlikely to have collision for both)

## Map



Map ADT supports several operations

- put (key, value)
- get (key)
- delete (key) ← not always needed

For closed hashing, deletion works poorly. Why? e.g. linear probing

	key	$h(\text{key})$
put	$k_1$	6
	$k_2$	2
	$k_3$	1
	$k_4$	3
put	$k_5$	1
delete	$k_3$	1
get	$k_5$	1

0		
1	$k_5$	$v_5$
2	$k_2$	$v_2$
3	$k_4$	$v_4$
4		
5		
6	$k_1$	$v_1$
7		
8		
9		

get ( $k_5$ ) will fail because slot 1 will be empty even though  $k_5$  is in the table

The previous slide  
is very important  
(even though it is only  
one slide)

## Map data structures (lectures 253)

- balanced search tree  
 $O(\log n)$  access

requires comparable keys  
and allows more ops (e.g. find the top  $k$  keys)

- hash table  
 $O(1)$  access  
[assuming good hash functions]

put  
get  
delete ← only open hashing

## Next lecture

- heaps (review COMP 250)
- AI should be posted by Thursday evening