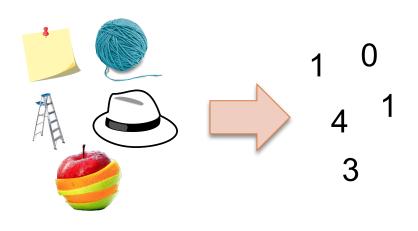


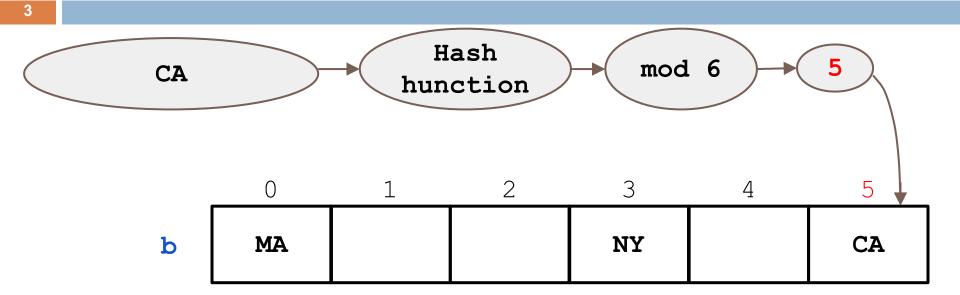
HASHING II

#### Hash Functions



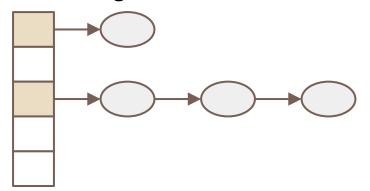
- □ Requirements:
  - ) deterministic
  - 2) return a number in [0..n]
- Properties of a good hash:
  - 1) fast
  - 2) collision-resistant
  - 3) evenly distributed
  - 4) hard to invert

add("CA")

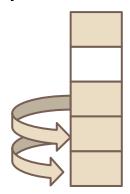


Two ways of handling collisions:

1. Chaining



2. Open Addressing



## HashSet and HashMap

```
Set<V>{
  boolean add(V value);
  boolean contains(V value);
  boolean remove(V value);
```

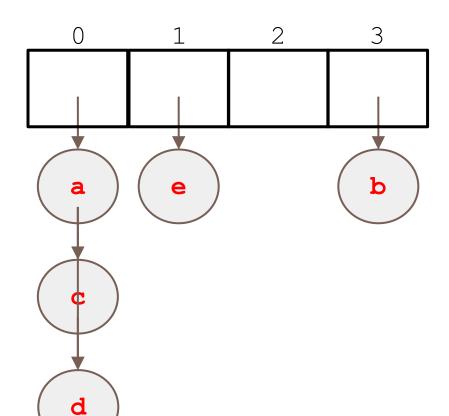
```
Map<K,V>{
  V put(K key, V value);
 V get(K key);
 V remove(K key);
```

#### Remove

#### Chaining

#### **Open Addressing**

put('a')
put('b')
put('c')
put('d')
get('d')
remove('c')
get('d')
put('e')



0	<u> </u>	<b>b</b>
a	u	D

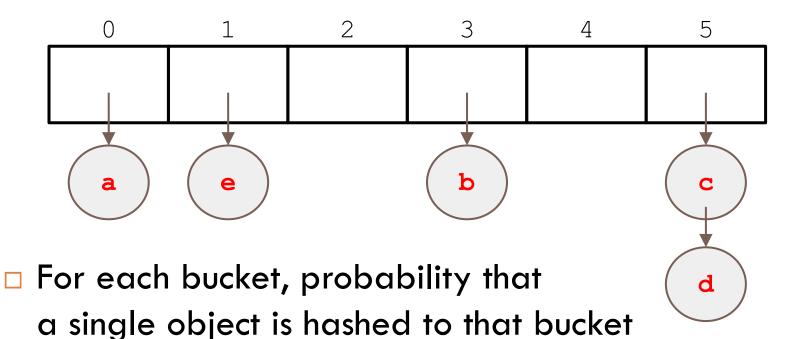
# Time Complexity (no resizing)

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	O(n)	O(n)
Open Addressing	O(n)	O(n)	O(n)

#### **Load Factor**

Load factor 
$$\lambda = \frac{\# of \ entries}{length \ of \ array}$$

### **Expected Chain Length**



□ There are n objects in the hash table

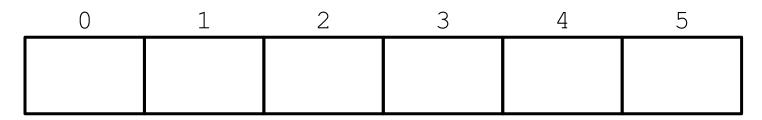
is 1/length of array

 $\square$  Expected length of chain is n/length of array =  $\lambda$ 

# Expected Time Complexity (no resizing)

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	$O(1 + \lambda)$	$O(1+\lambda)$
Open Addressing			

## Expected Number of Probes



- We always have to probe H(v)
- $\square$  With probability  $\lambda$ , first location is full, have to probe again
- $\square$  With probability  $\lambda \cdot \lambda$ , second location is also full, have to probe yet again
- □ ...
- □ Expected #probes =  $1 + \lambda + \lambda^2 + ... = \frac{1}{1-\lambda}$

# Expected Time Complexity (no resizing)

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	0(1)	0(1)
Open Addressing	0(1)	0(1)	0(1)

Assuming constant load factor
We need to dynamically resize!

## **Amortized Analysis**



VS.



In an amortized analysis, the time required to perform a sequence of operations is averaged over all the operations

Can be used to calculate
 average cost of operation

## Amortized Analysis of put

- □ Assume dynamic resizing with load factor  $\lambda = \frac{1}{2}$ :
  - $lue{}$  Most put operations take (expected) time O(1)
  - $\square$  If  $i=2^j$ , put takes time O(i)
  - Total time to perform n put operations is  $n \cdot O(1) + O(2^0 + 2^1 + 2^2 + ... + 2^j)$
  - Average time to perform 1 put operation is

$$O(1) + O\left(\frac{1}{2^{j}} + \frac{1}{2^{j-1}} + \dots + \frac{1}{4} + \frac{1}{2} + 1\right) = O(1)$$

# Expected Time Complexity (with dynamic resizing)

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	0(1)	0(1)
Open Addressing	0(1)	0(1)	0(1)

# Cuckoo Hashing



## Cuckoo Hashing

- Alternative solution to collisions
- Assume you have two hash functions H1 and H2

element	а	b	С	d	е
H1	0	9	17	11	5
H2	5	2	10	3	13

0	1	2	3	4	5
а		b	A	С	<b>e</b>

What if there are loops?

# Complexity of Cuckoo Hashing

#### ■ Worst Case:

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	O(n)	O(n)
Open Addressing	O(n)	O(n)	O(n)
Cuckoo Hashing	$\infty$	0(1)	0(1)

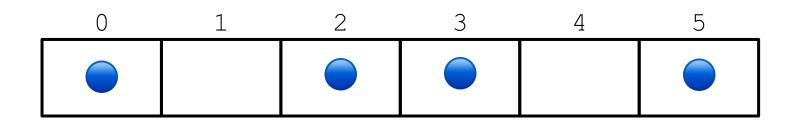
#### Expected Case:

Collision Handling	put(v)	get(v)	remove(v)
Chaining	0(1)	0(1)	0(1)
Open Addressing	0(1)	0(1)	0(1)
Cuckoo Hashing	0(1)	0(1)	0(1)

#### **Bloom Filters**

- Assume we only want to implement a set
- What if you had stored the value at "all" hash locations (instead of one)?

element	а	b	С	d	е
H1	0	9	17	11	5
H2	5	2	10	3	13



#### Features of Bloom Filters

- $\square$  Worst-case O(1) put, get, and remove
- Works well with higher load factors
- But: false positives