



# CSCI 241

Lecture 16

A3 Overview, Map ADT, Rehashing, Open Addressing

# Goals

- Understand the architecture of A3
- Understand the purpose and operations of the Map ADT.
- Know how to respond to large hash table load factors by resizing the array and **rehashing**.
- Know how to avoid using LinkedList buckets using **open addressing** with **linear** or **quadratic probing**.
- Understand the relationship between Java Object's **hashCode** and **equals** methods.

# Announcements

- A3 is out

**A3 has 4 phases.**

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It may sound scary.

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It isn't so bad:

- total lines of code is probably  $\leq A2$
- nothing here is as tricky as AVL rebalance
- you're given unit tests

# A3 has 4 phases.

0. Write an ArrayList clone



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0. Write an ArrayList clone  
(done in Lab 6!)

**A3 has 3 phases.**

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1. Write a min-heap to implement a priority queue with operations:
  - `boolean add(V value, P priority)`
  - `V peek();`
  - `V poll();`

# A3 has 3 phases.

↙ use `AList` to handle growing the array!

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use AList to handle growing the array!



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2. Write a hash table.

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use AList to handle growing the array!



1. Write a min-heap to implement a priority queue with operations:
  - `boolean add(V value, P priority)`
  - `V peek();`
  - `V poll();`
2. Write a hash table.
3. Use the hash table to augment the heap, making the following operations efficient:
  - `boolean contains(V v);`
  - `void changePriority(V v, P newP);`

# A3 has 3 phases.

use AList to handle growing the array!

1. Write a min-heap to implement a priority queue with operations:

- `boolean add(V value, P priority)`
- `V peek();`
- `V poll();`

(not using AList to handle growing the array)

2. Write a hash table.

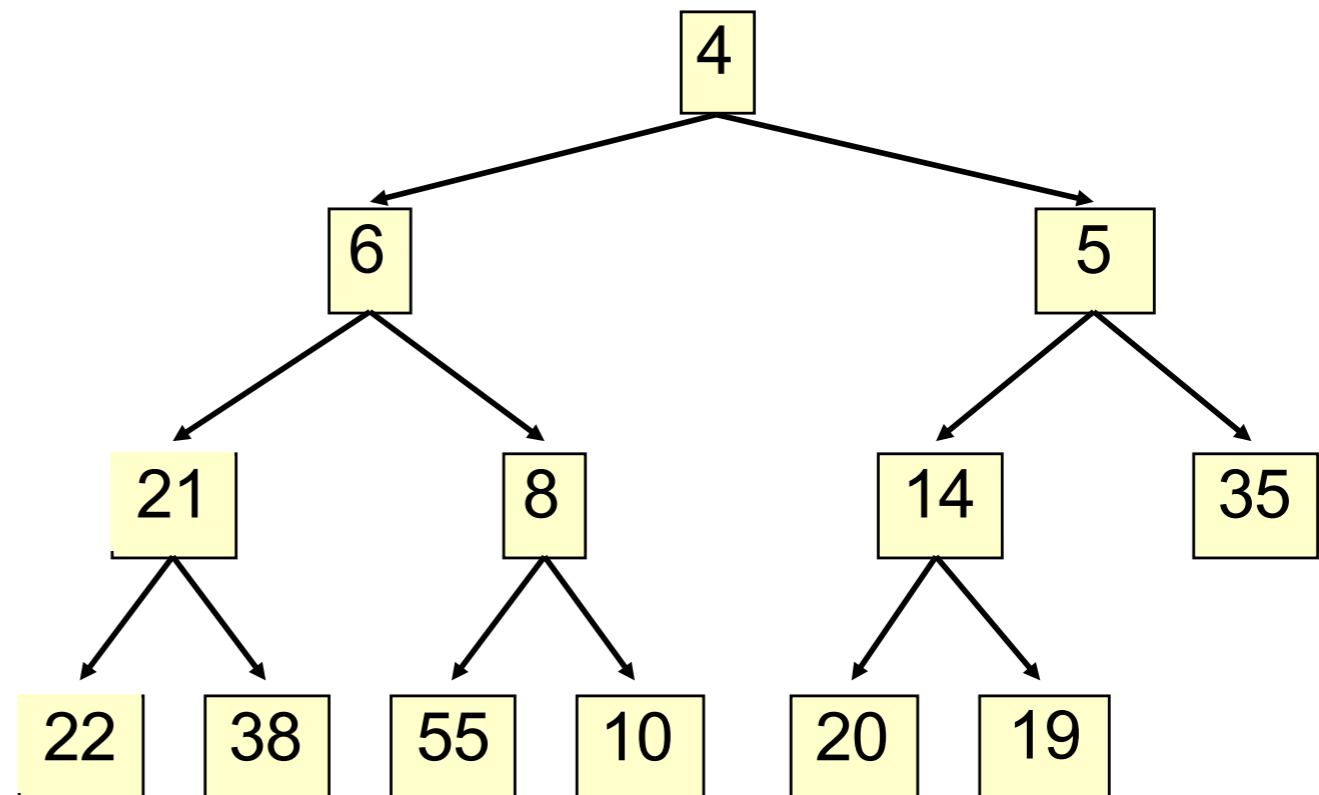
3. Use the hash table to augment the heap, making the following operations efficient:

- `boolean contains(V v);`
- `void changePriority(V v, P newP);`

# Phase 3 - Hash your Heap

In Phase 1 Heap:

- contains requires searching the whole tree.
- `changePriority` requires searching the whole tree, then bubbling down or up.





# Phase 3 - Hash your Heap

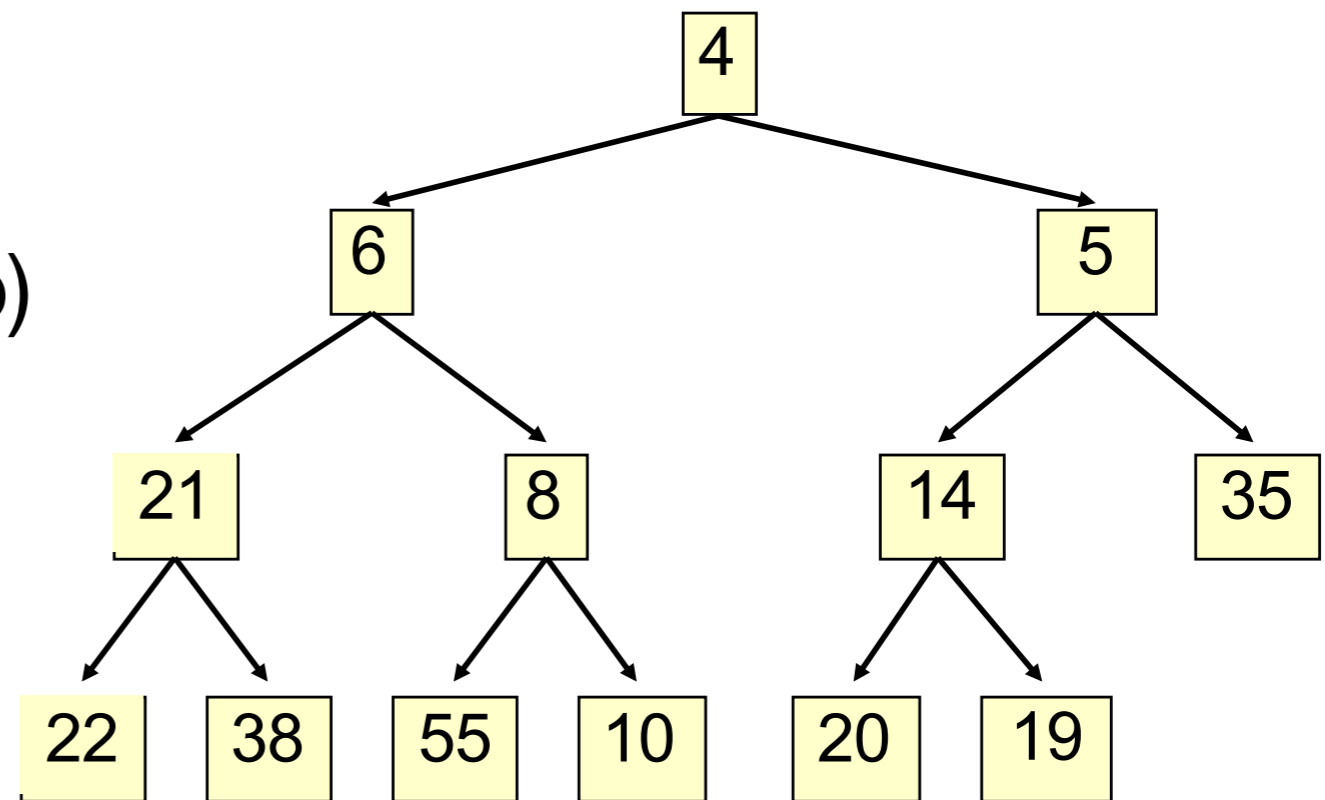
In Phase 3 Heap:

- Each heap value is stored in the heap **and** in a HashTable that tracks its index in the heap.

HashTable<V, Integer>:

value    i (index in heap)

4	0
8	4
6	1
38	8
35	6
21	3
10	10
10	10



0 1 2 3 4 5 6 7 8 9 10 11 12  
Heap: [ 4 6 5 21 8 14 35 22 38 55 10 20 19 ]

# Phase 3 - Hash your Heap

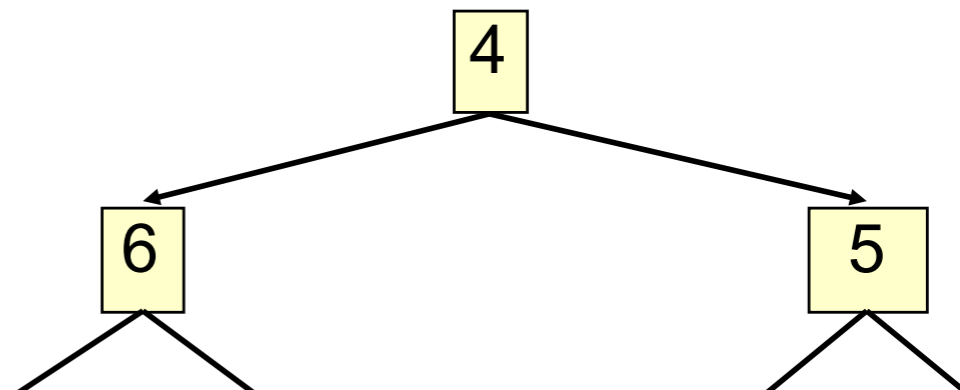
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To maximize confusion:

- The hash table is used to map Heap *values* to heap *indices*.
- The hash table's *keys* are the heap's *values*

0 1 2 3 4 5 6 7 8 9 10 11 12  
Heap: [ 4 6 5 21 8 14 35 22 38 55 10 20 19 ]

# Phase 3 - Hash your Heap

In Phase 3 Heap:

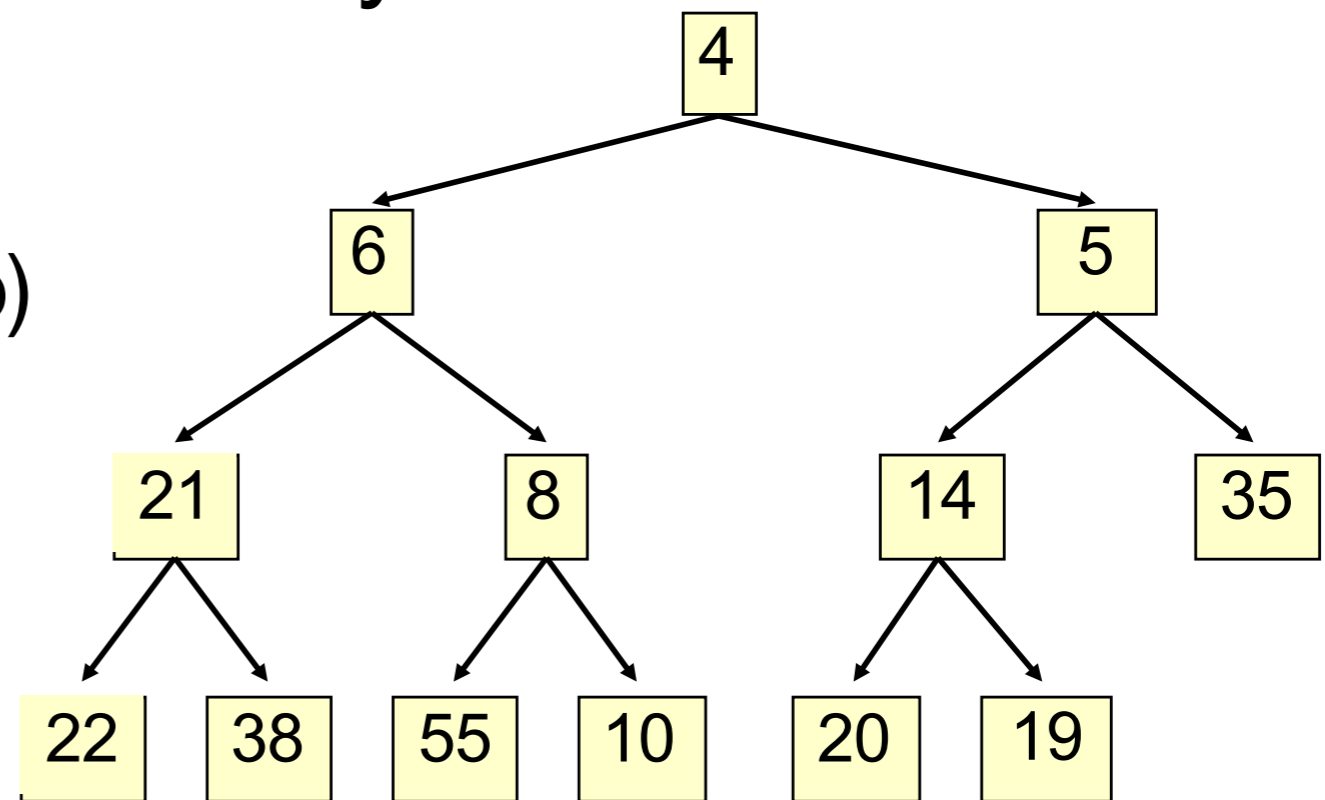
`boolean contains(V v):`

true iff map contains key `v`

`HashTable<V, Integer>:`

value i (index in heap)

4	0
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# Phase 3 - Hash your Heap

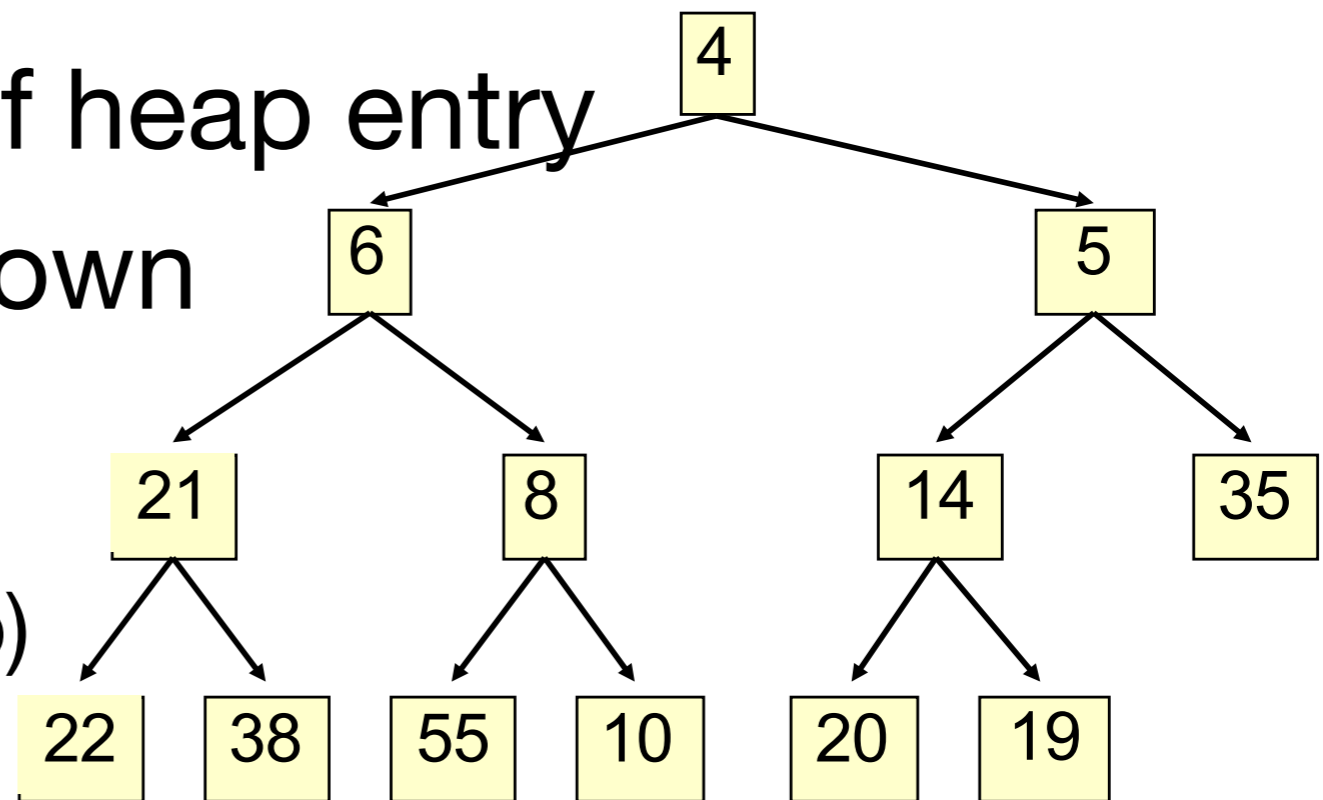
In Phase 3 Heap:

```
void changePriority(V v, P newP):
```

```
    i = map.get(v);
```

```
    change priority of heap entry
```

```
    bubble it up or down
```



HashTable<V, Integer>:

value i (index in heap)

4	0
8	4
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0 1 2 3 4 5 6 7 8 9 10 11 12  
Heap: [ 4 6 5 21 8 14 35 22 38 55 10 20 19 ]

# Questions?

# Origins of the term “hash”



**Hans Peter Luhn** (July 1, 1896 – August 19, 1964) was a researcher in the field of computer science, and, Library & Information Science for **IBM**

# The Map ADT

- In math, a **map** is a function.
- What is a function, anyway?

# The Map ADT

- In math, a **map** is a function.

- If  $F$  is a map then

$$F(a) \rightarrow b$$

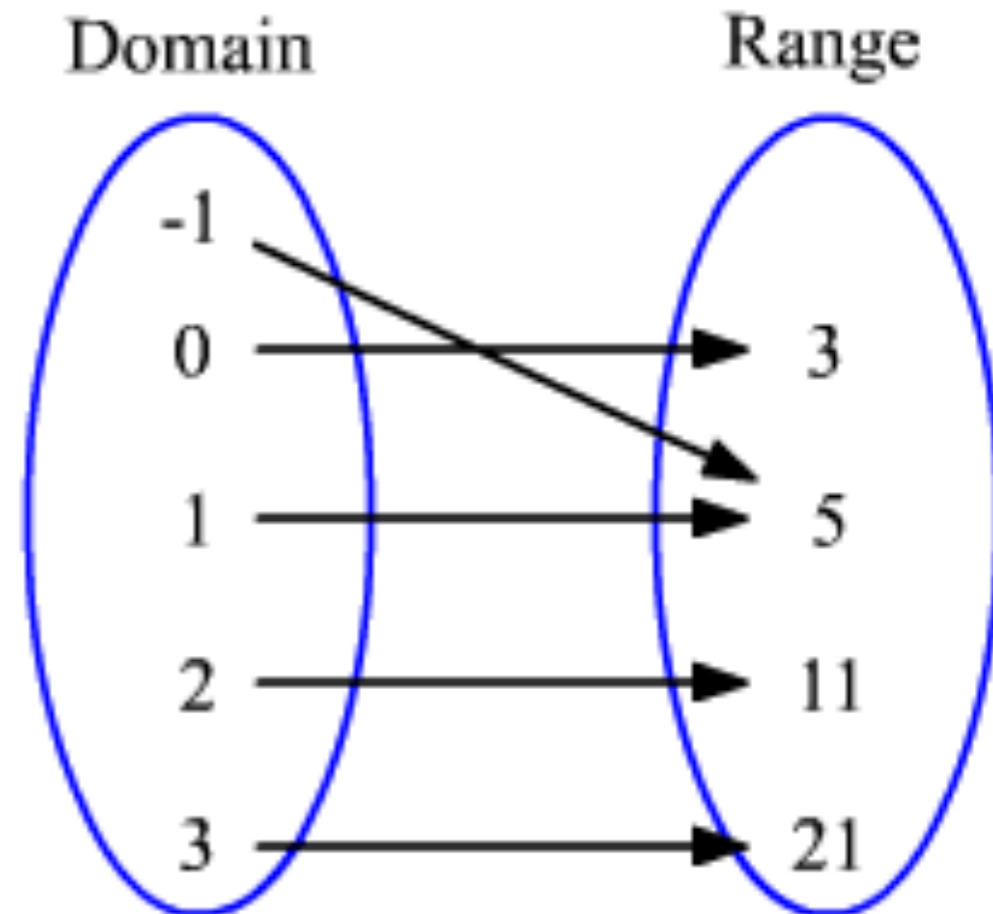
means that  $a$  maps to  $b$ .

- $F$  has a:

- **domain** - the set of values  $F$  maps **from**

- **range** - the set of values that  $F$  maps a domain element **to**

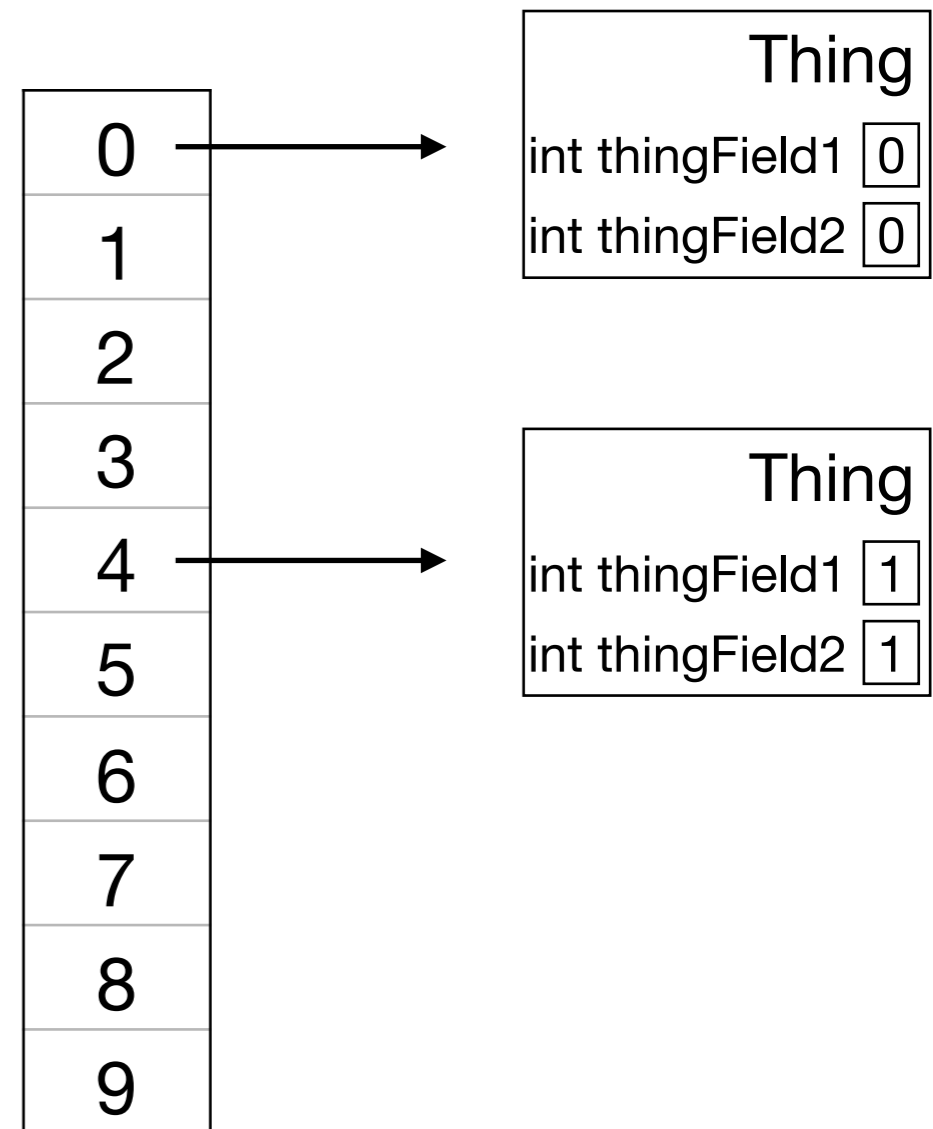
- **codomain** - the set of **all** possible values in the range's type, regardless of whether any element in the domain maps to it





# The Map ADT

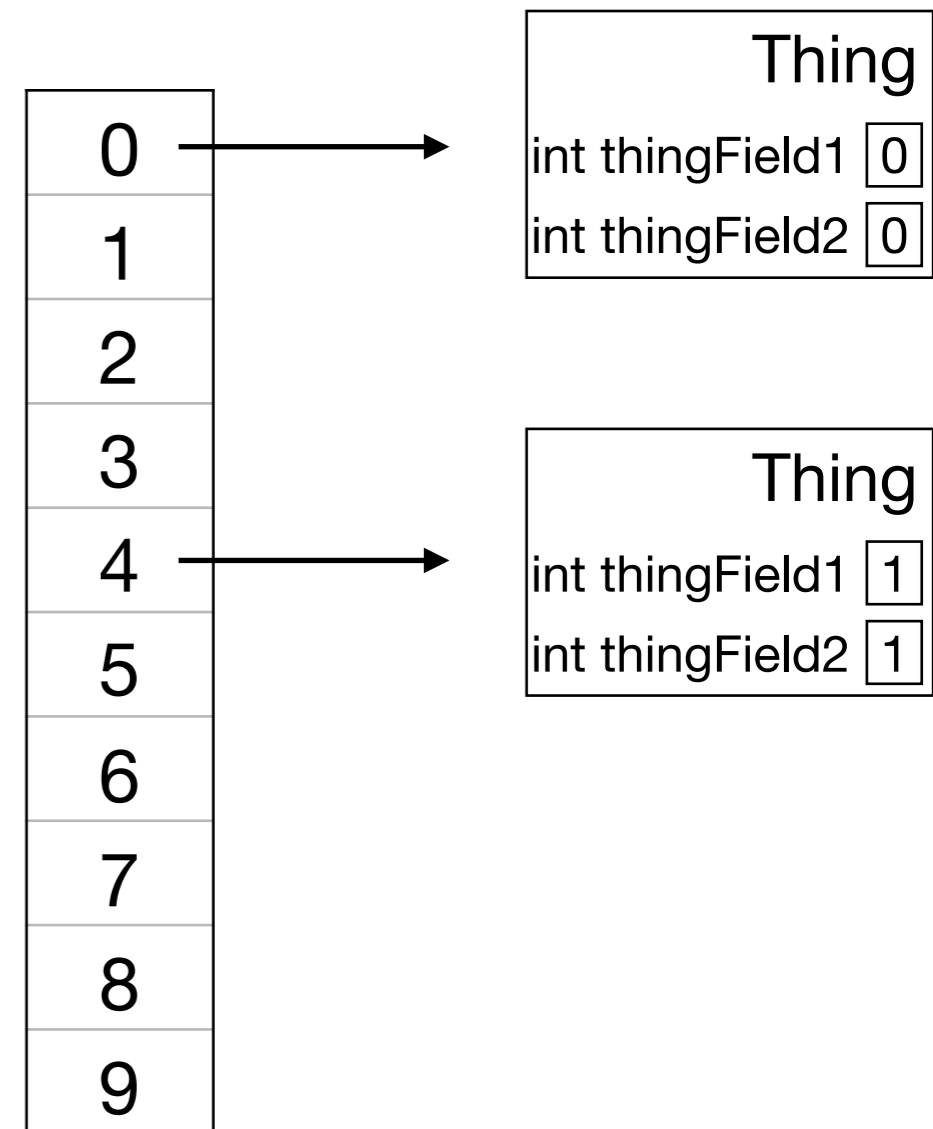
```
Thing[] a = new Thing[10];
```



# The Map ADT

- Arrays are great!
- Domain:  $0..a.length$
- Range: all elements stored in the array
- Codomain: the **type** of elements stored in the array.

```
Thing[] a = new Thing[10];
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# The Map ADT

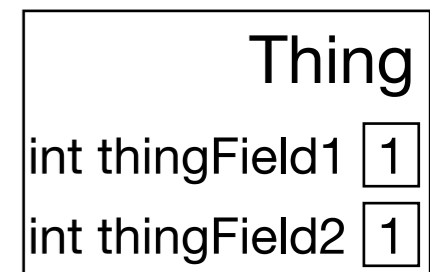
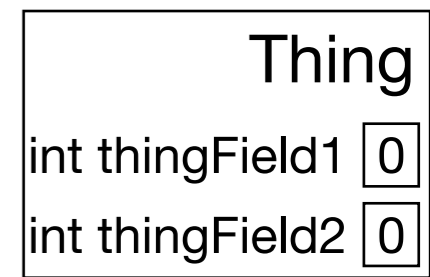
- Arrays are great!
- Domain:  $0..a.length$
- Range: all elements stored in the array
- Codomain: the **type** of elements stored in the array.

```
Thing[] a = new Thing[10];
```

Domain:



Range:



We get to choose the **codomain**.

Codomain: Thing objects.

# The Map ADT

- Arrays are great!
- We get to choose the codomain - type of the array.
- Wouldn't it be nice to choose the domain as well?
- The Map ADT represents a mapping from **keys** to **values**.
  - we get to choose the type of the **keys** (domain) AND the **values** (codomain)

# The Map Interface

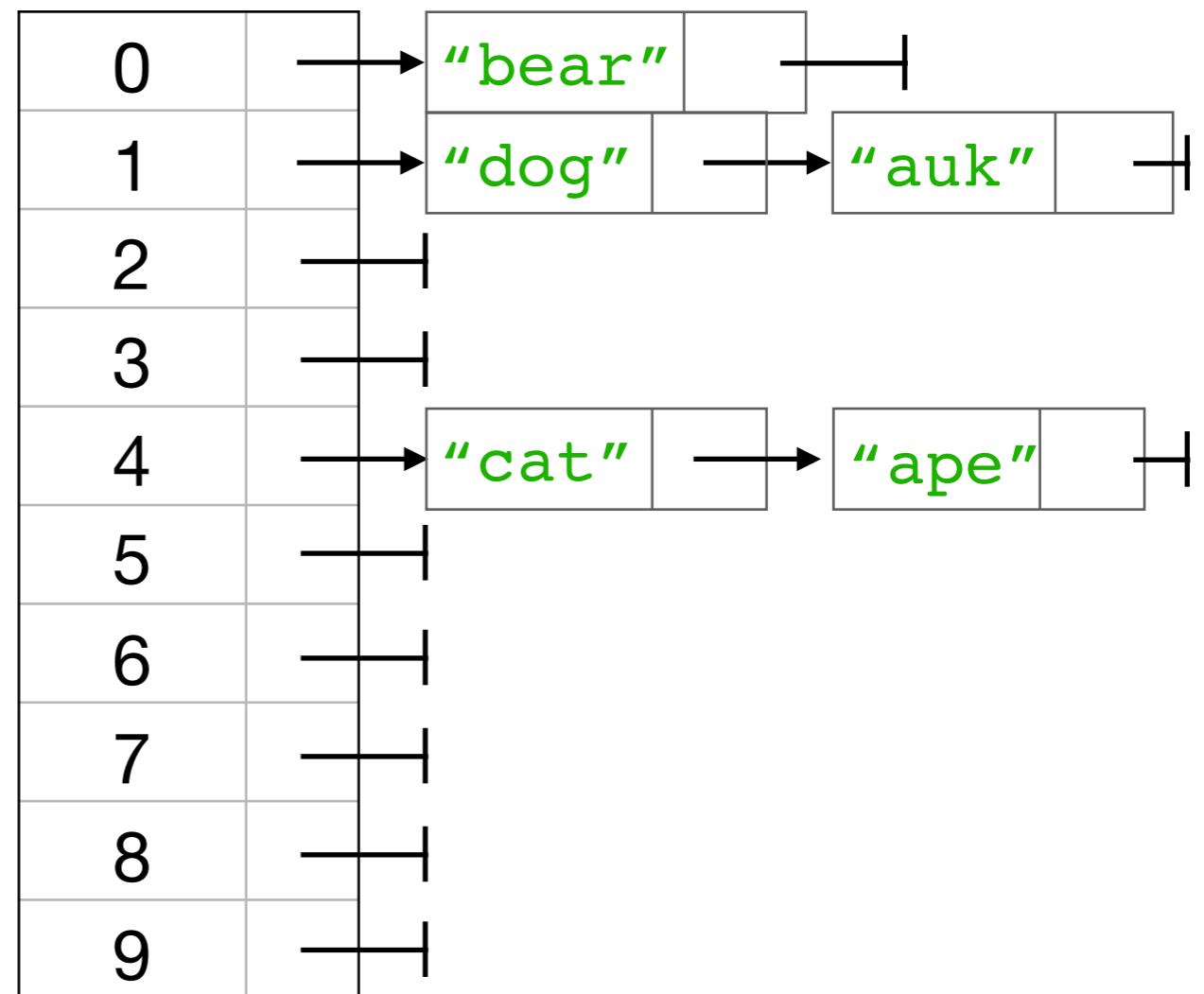
```
public interface Map<K, V> {  
    /** Returns the value to which the specified key  
     * is mapped, or null if this map contains no  
     * mapping for the key. */  
    V get(Object key);  
  
    /** Associates the specified value with the  
     * specified key in this map */  
    V put(K key, V value);  
  
    /** Removes the mapping for a key from this map  
     * if it is present */  
    V remove(Object key);  
  
    // more methods  
}
```

# Implementing Map<K,V>

- Use a HashTable!
- Hash the key to determine array index
- Store values in array

$h(k) = k \% A.length$

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

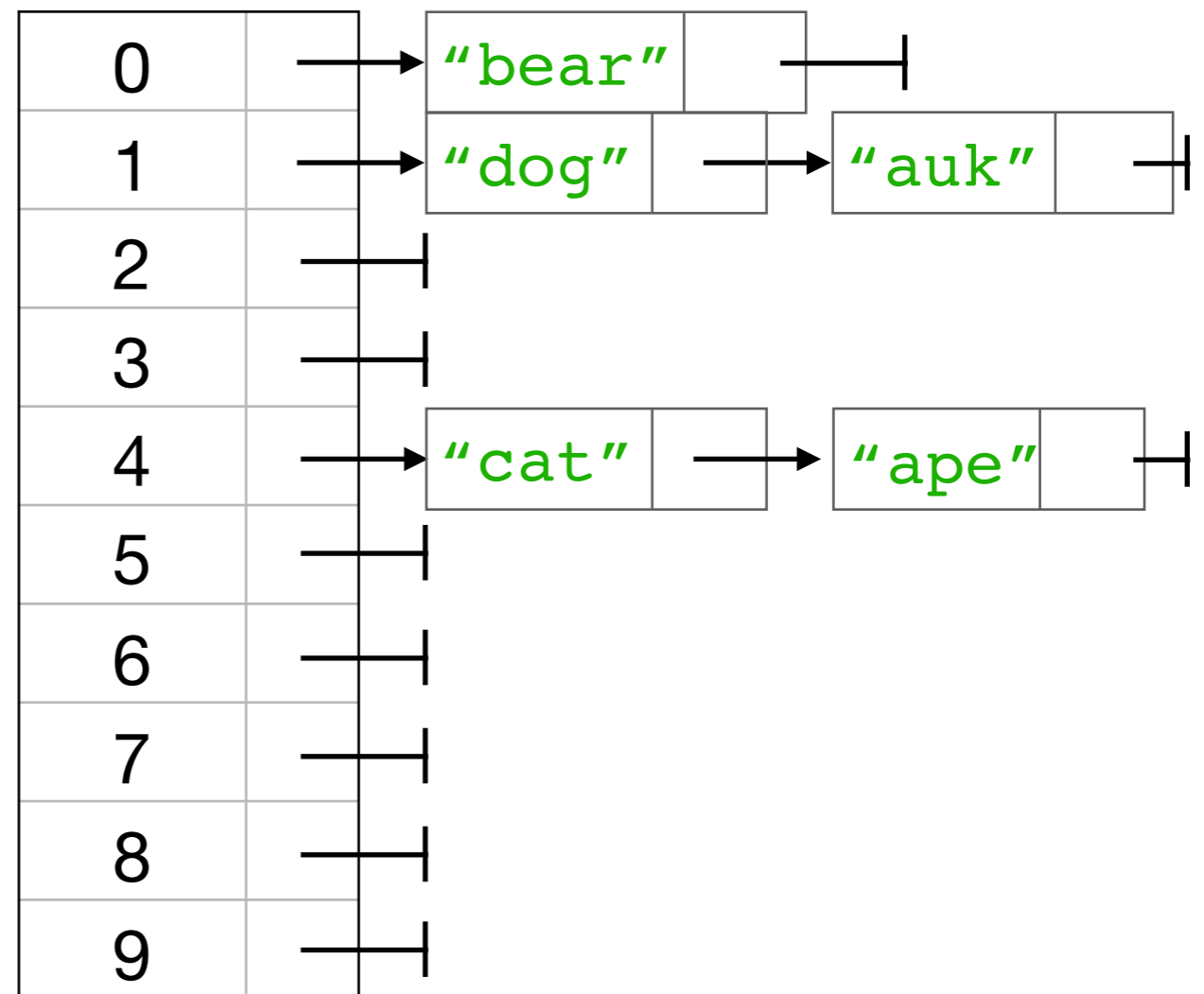


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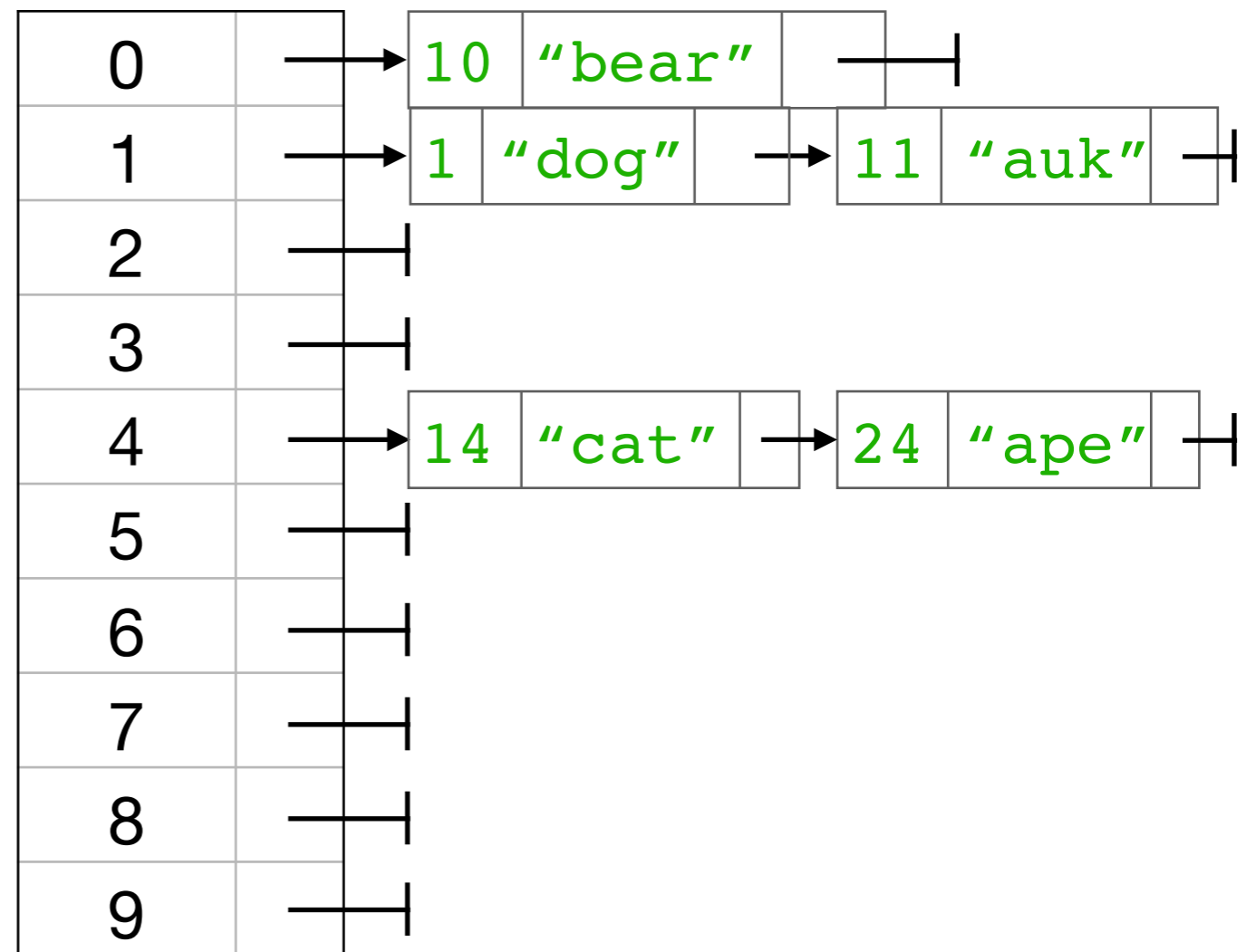
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put(14, "cat");  
put(24, "ape");
```



# Implementing Map<K,V>

- Use a HashTable (or a HashSet of Key-Value pairs)
- Hash the key to determine array index
- ~~Store values in array~~
- Store (K,V) pairs in the array.

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```





# Hash Tables: Load Factor

$$\frac{\text{\# entries in table}}{\text{size of the array}}$$

# Hash Tables: Load Factor

How full is your hash table?

$$\text{Load factor } \lambda = \frac{\text{\# entries in table}}{\text{size of the array}}$$

The average bucket size is  $\lambda$ .

Average-case runtime is  $O(\lambda)$ .

# Hash Tables: Load Factor

# entries in table

---

size of the array

# Hash Tables: Load Factor

$$\text{Load factor } \lambda = \frac{\text{\# entries in table}}{\text{size of the array}}$$

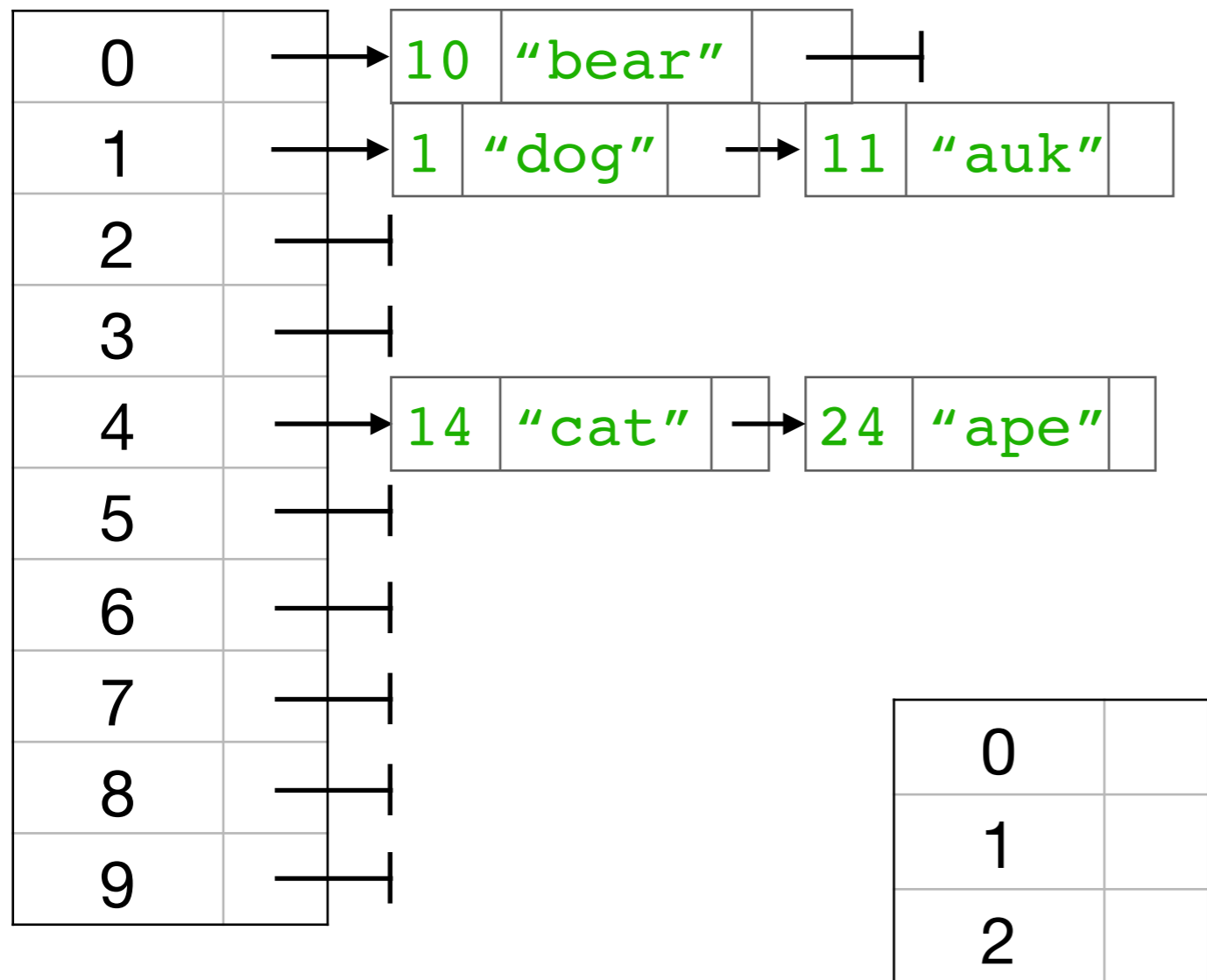
Average-case runtime is  $O(\lambda)$ .

- If  $\lambda$  is large, runtime is slow.
- If  $\lambda$  is small, memory is wasted.

Strategy: grow or shrink array when  $\lambda$  gets too large or small.

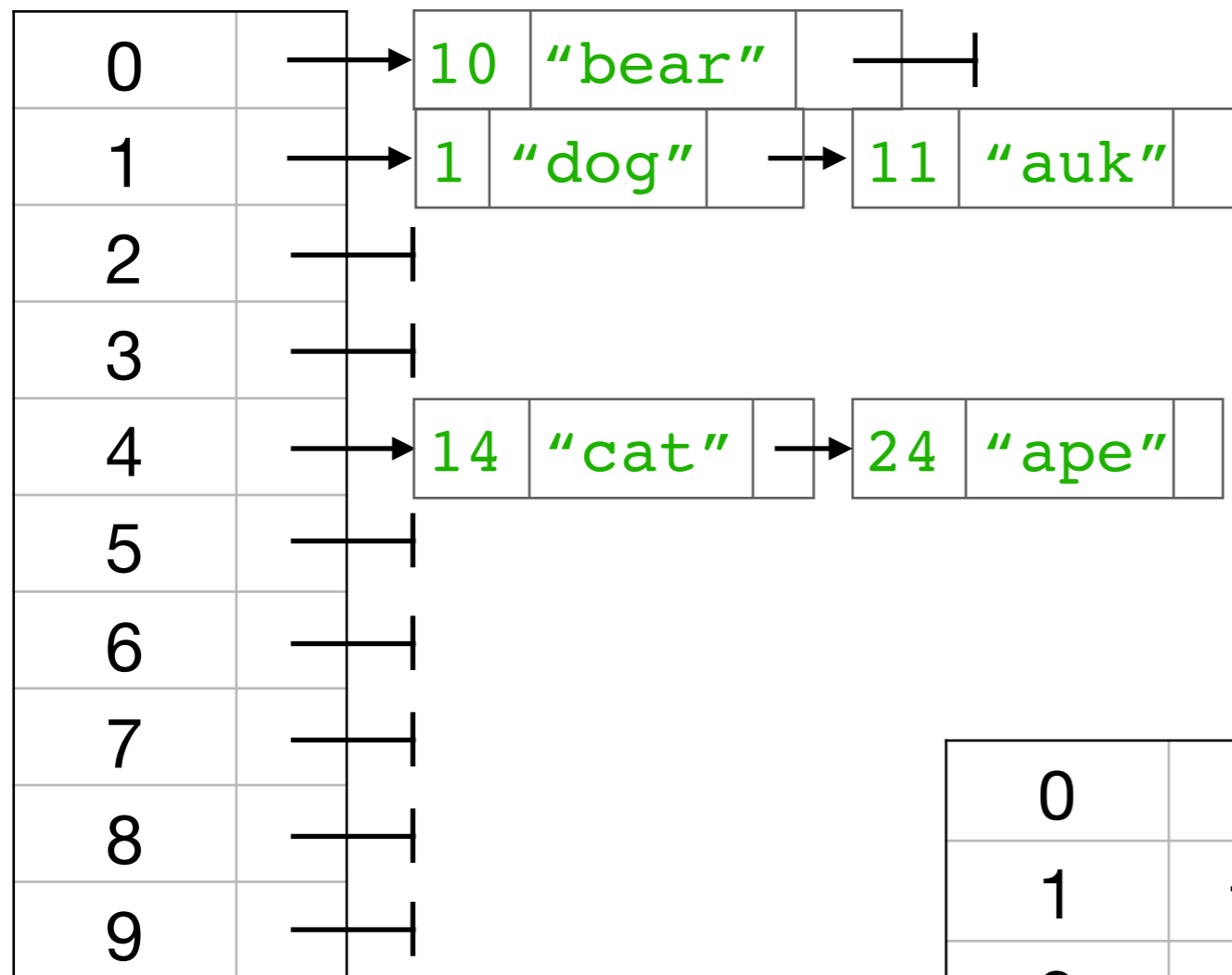
# Shrinking the array

Requires **rehashing**: put each element where it belongs in the new array.

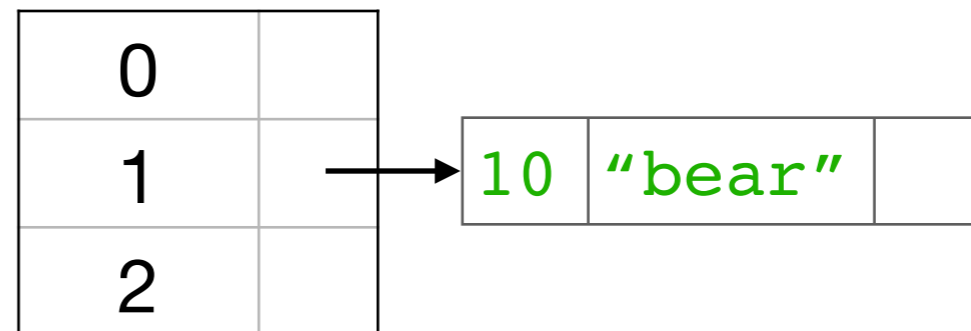


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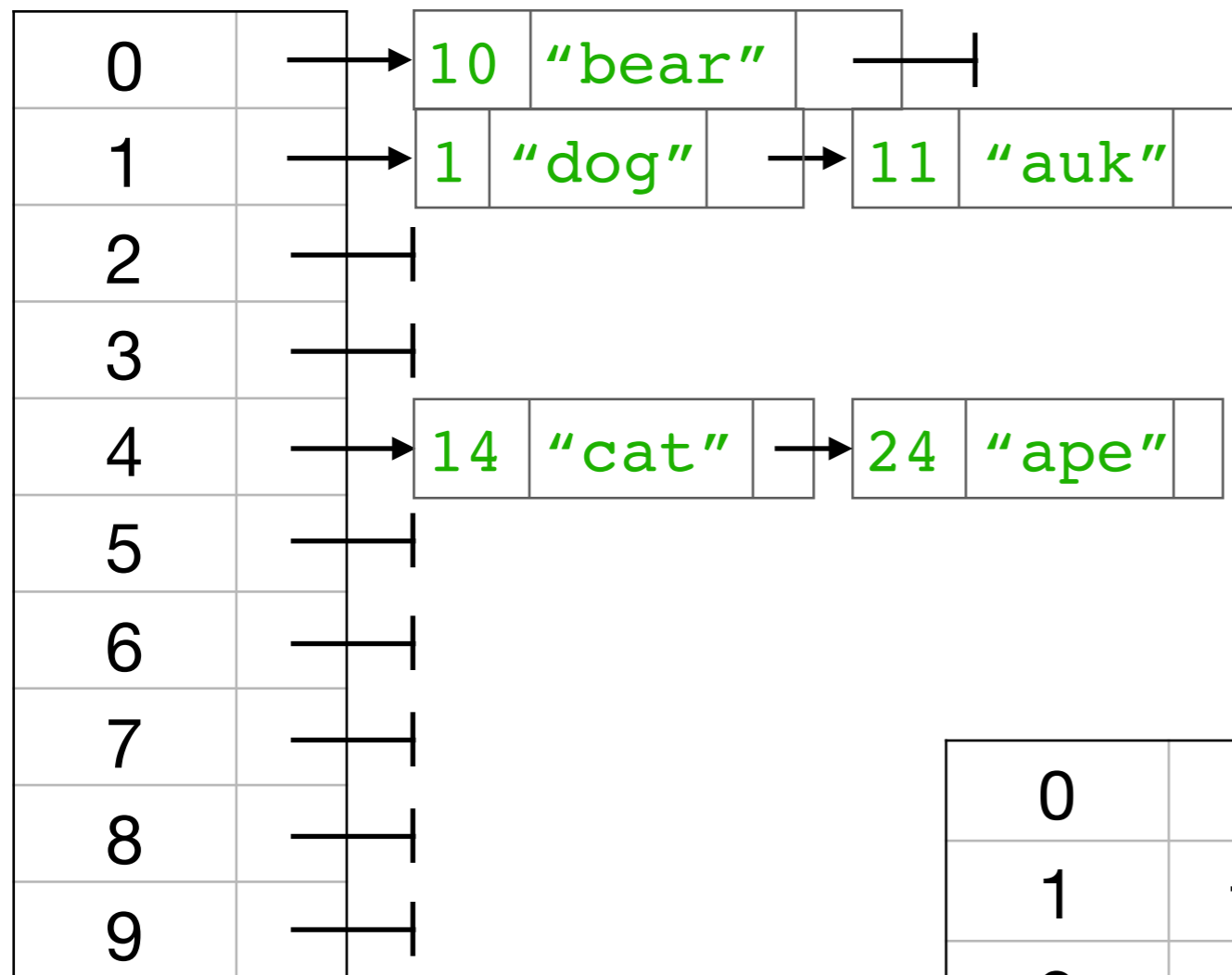


$$(10 \% 3) \rightarrow 1$$



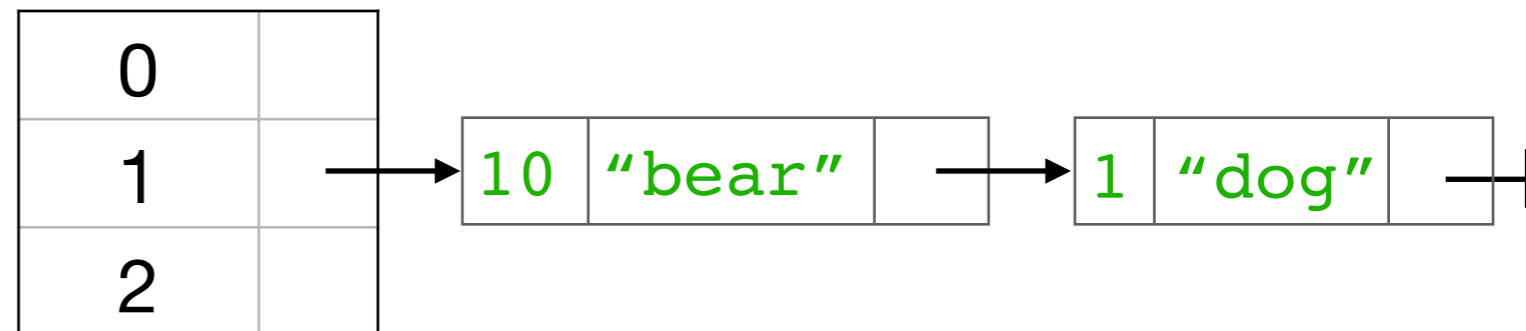
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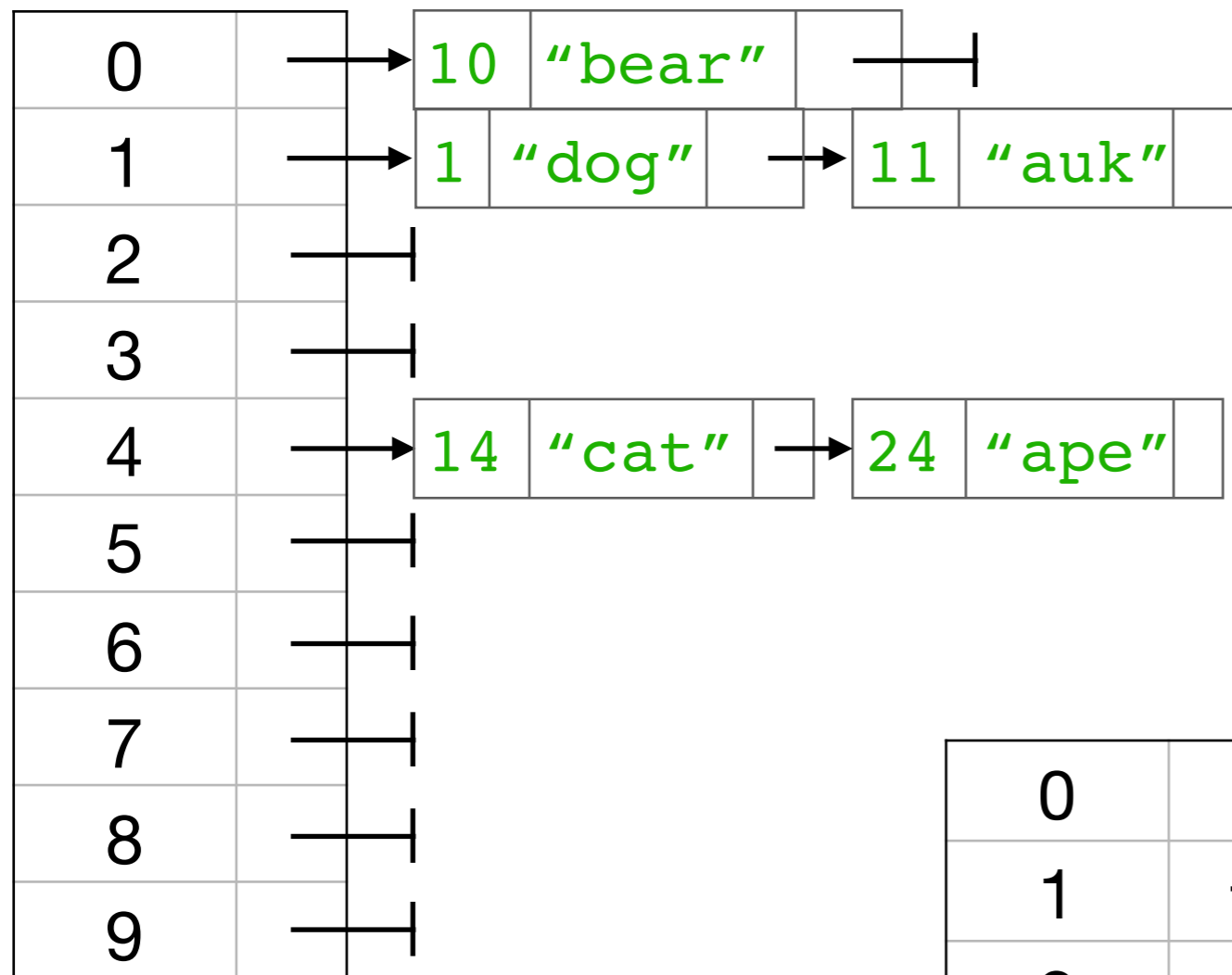
$$(10 \% 3) \rightarrow 1$$

$$(1 \% 3) \rightarrow 1$$



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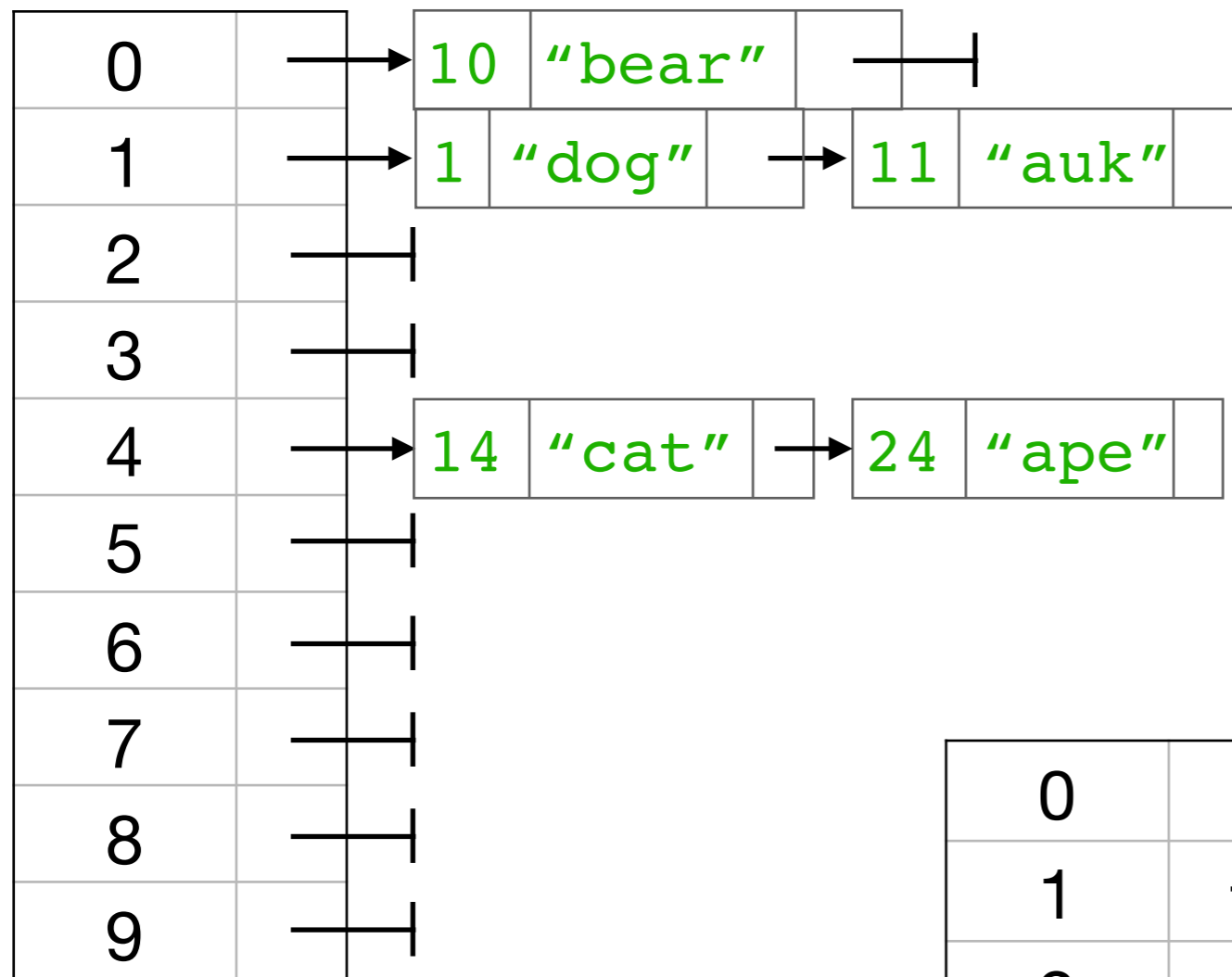
$$(11 \% 3) \rightarrow 2$$





# Shrinking the array

Requires **rehashing**: put each element where it belongs in the new array.

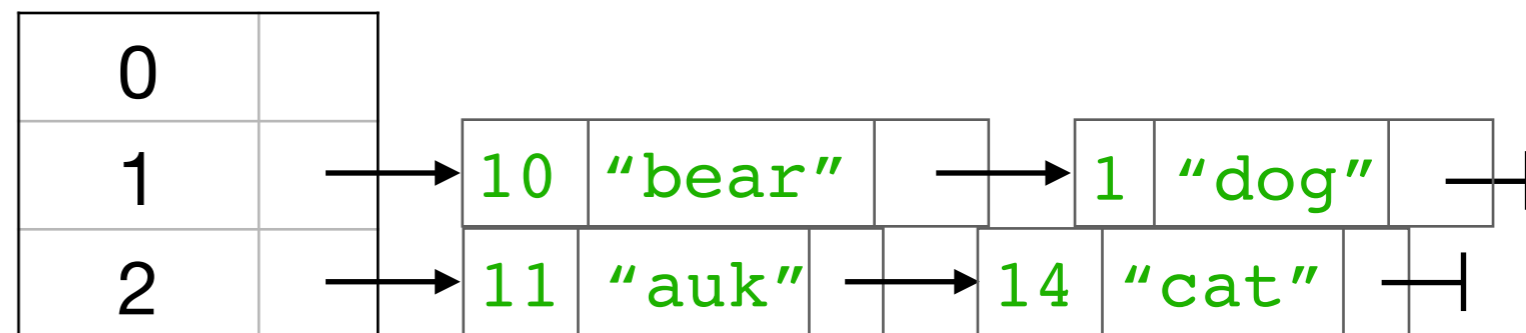


$$(10 \% 3) \rightarrow 1$$

$$(1 \% 3) \rightarrow 1$$

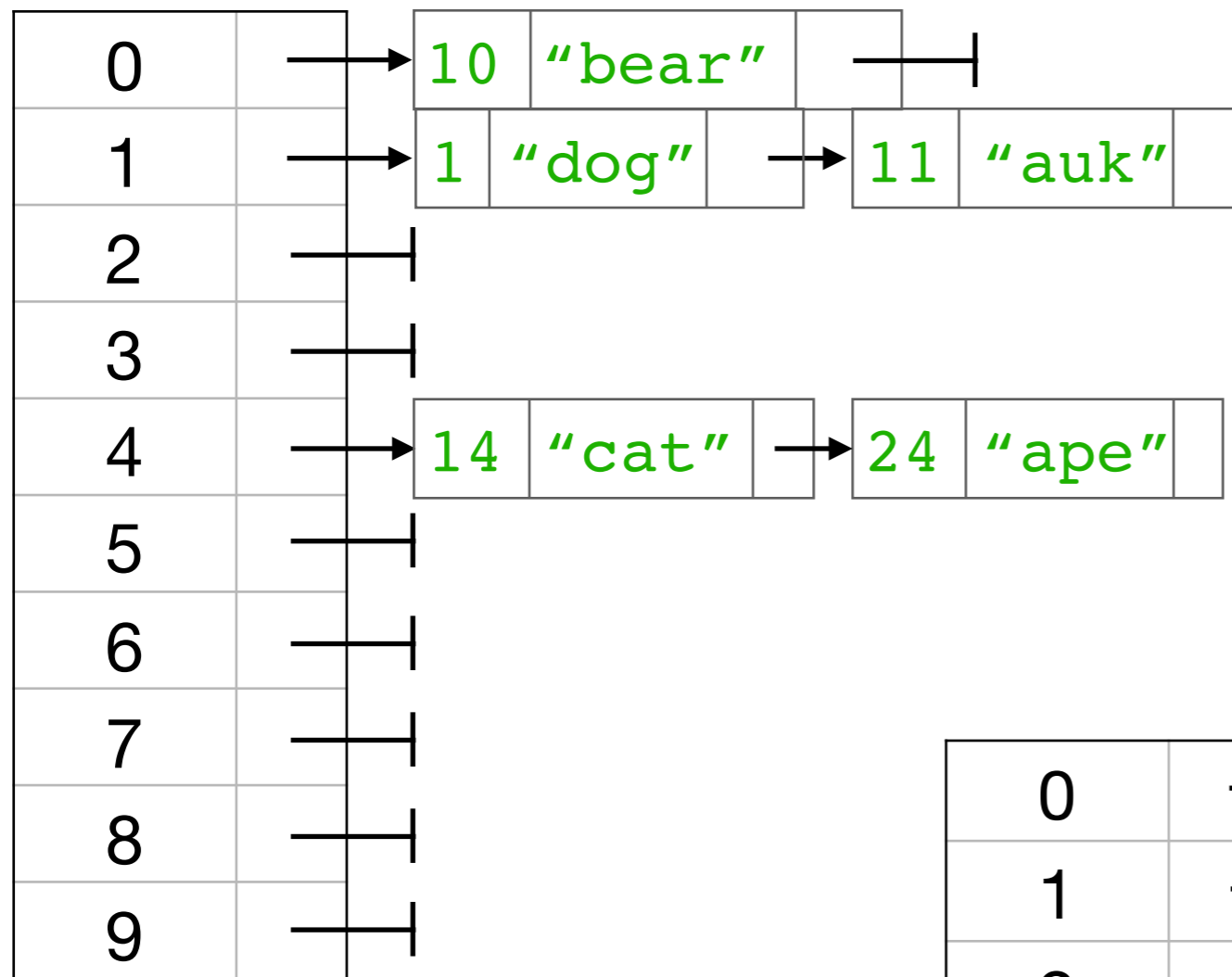
$$(11 \% 3) \rightarrow 2$$

$$(14 \% 3) \rightarrow 2$$



# Shrinking the array

Requires **rehashing**: put each element where it belongs in the new array.



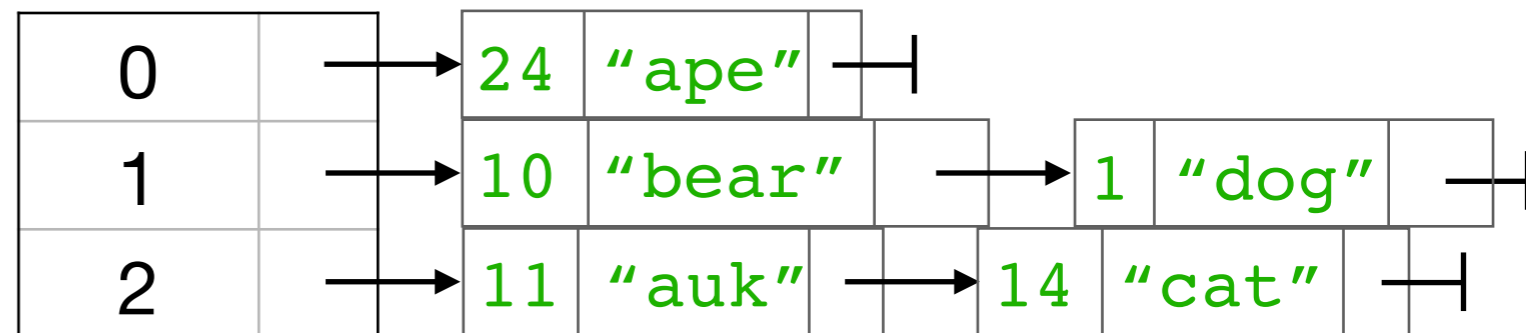
$$(10 \% 3) \rightarrow 1$$

$$(1 \% 3) \rightarrow 1$$

$$(11 \% 3) \rightarrow 2$$

$$(14 \% 3) \rightarrow 2$$

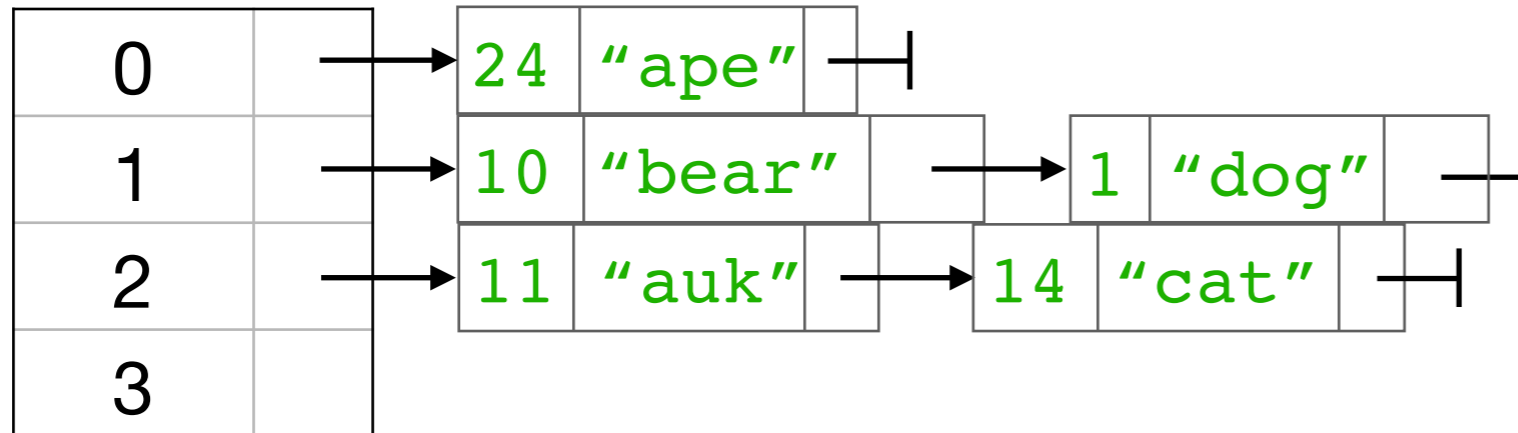
$$(24 \% 3) \rightarrow 0$$



# Growing the array

**Also** requires **rehashing**: put each element where it belongs in the new array.

Exercise: **Grow the array to size 6 and rehash:**



0	
1	
2	
3	
4	
5	

**ABCD:**

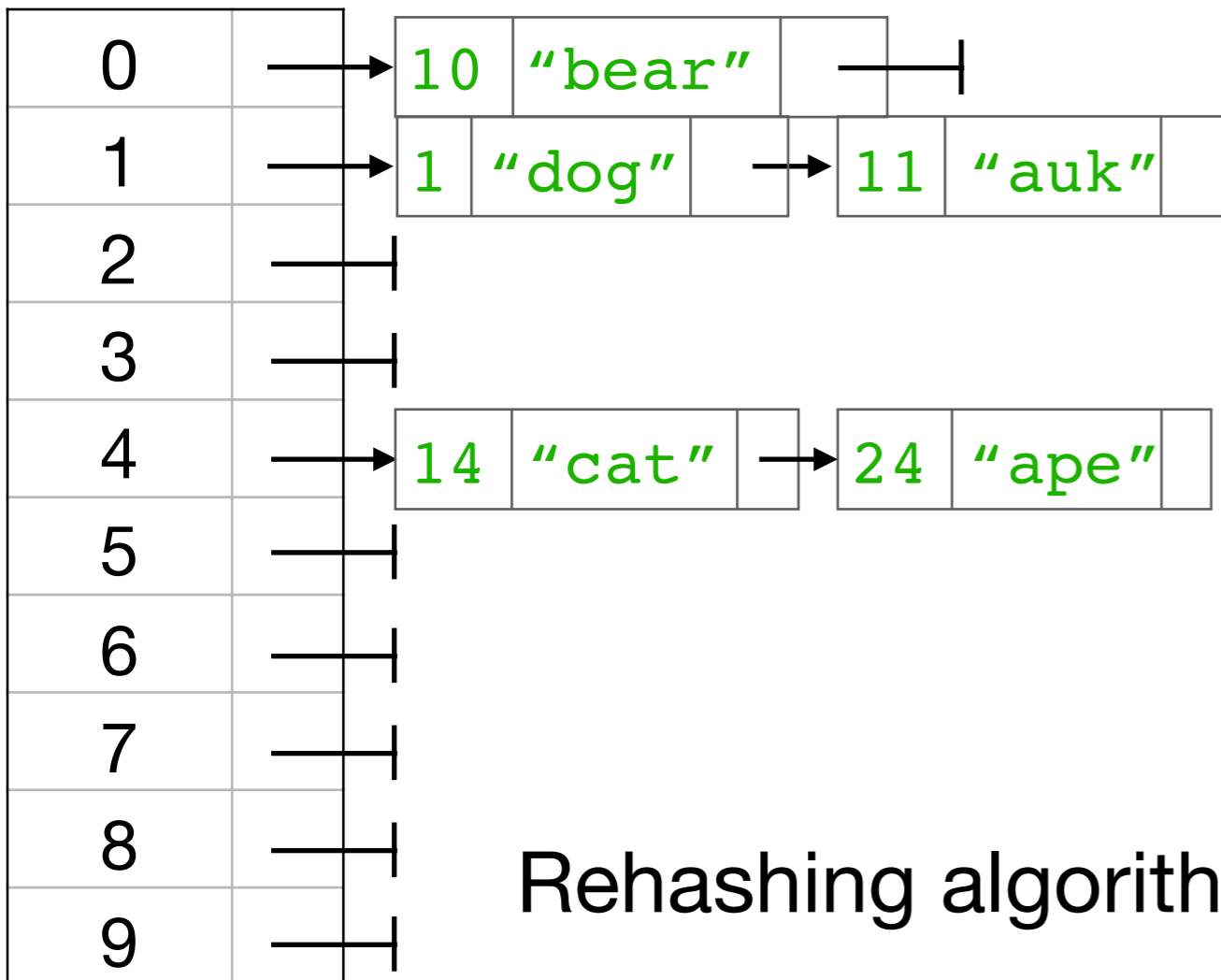
How many elements are in the most full bucket?

- A. 1
- B. 2
- C. 3
- D. 4

# Rehashing: Runtime

Let  $N$  = array size

Let  $n$  = number of entries



Rehashing algorithm:

visits  $N$  buckets

visits  $n$  entries (total)

could be  $O(n) =$

for each bucket  $b$ :

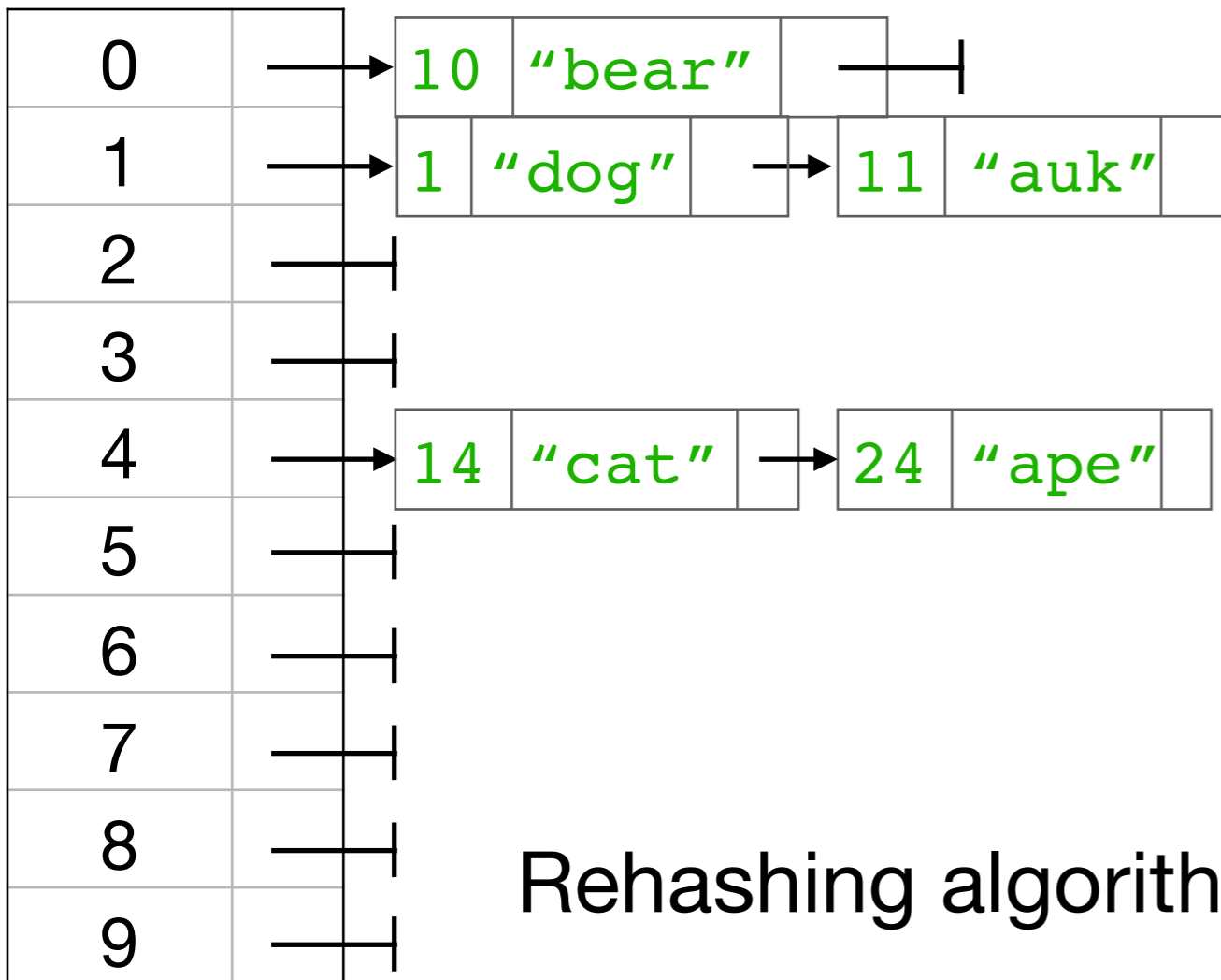
for each element  $e$  in  $b$ :

put  $e$  into the new array

# Rehashing: Runtime, take 1

Let  $C$  = array size

Let  $n$  = number of entries



Rehashing algorithm:

for each bucket  $b$ :

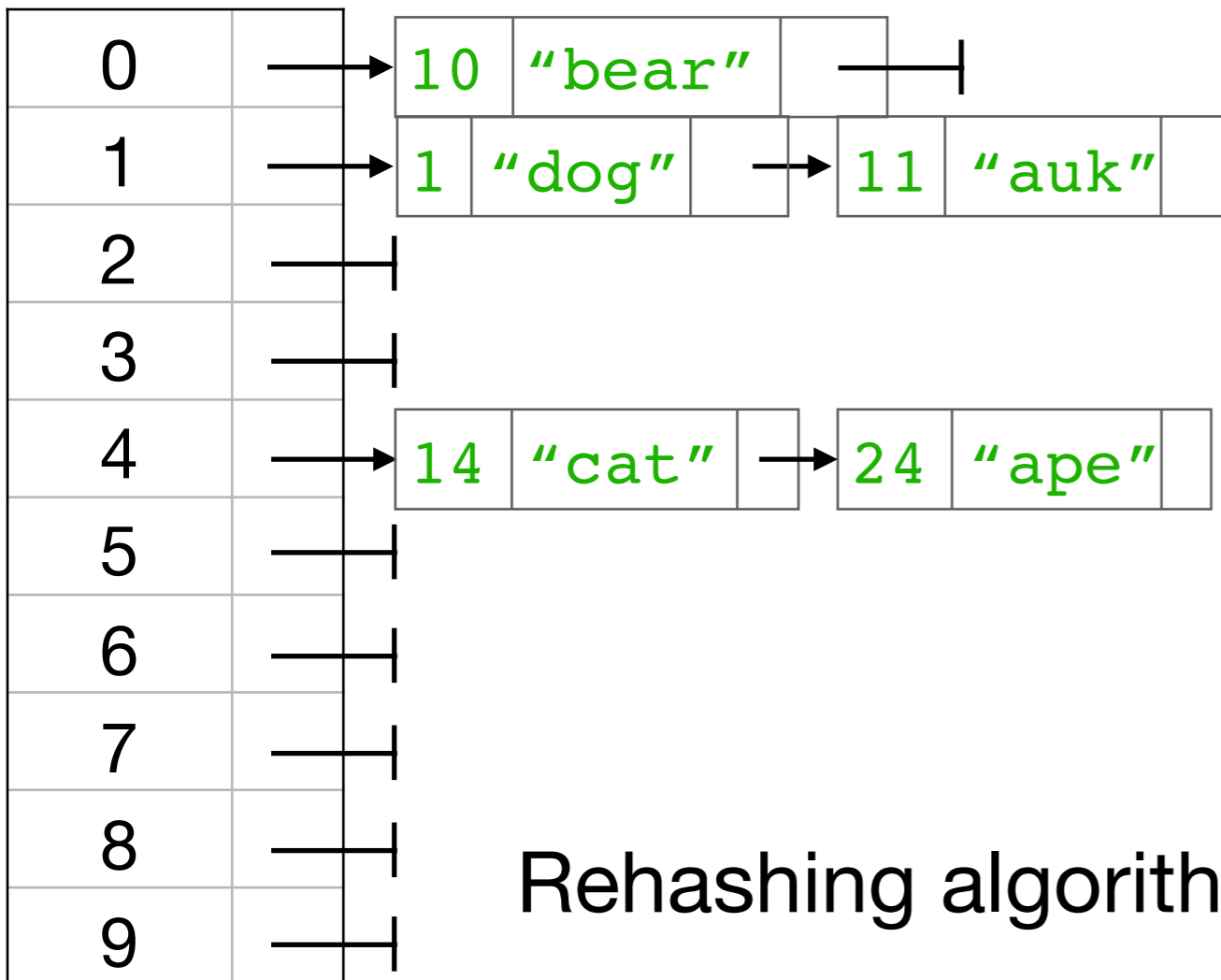
    for each element  $e$  in  $b$ :

        put  $e$  into the new array

# Rehashing: Runtime, take 1

Let  $C$  = array size

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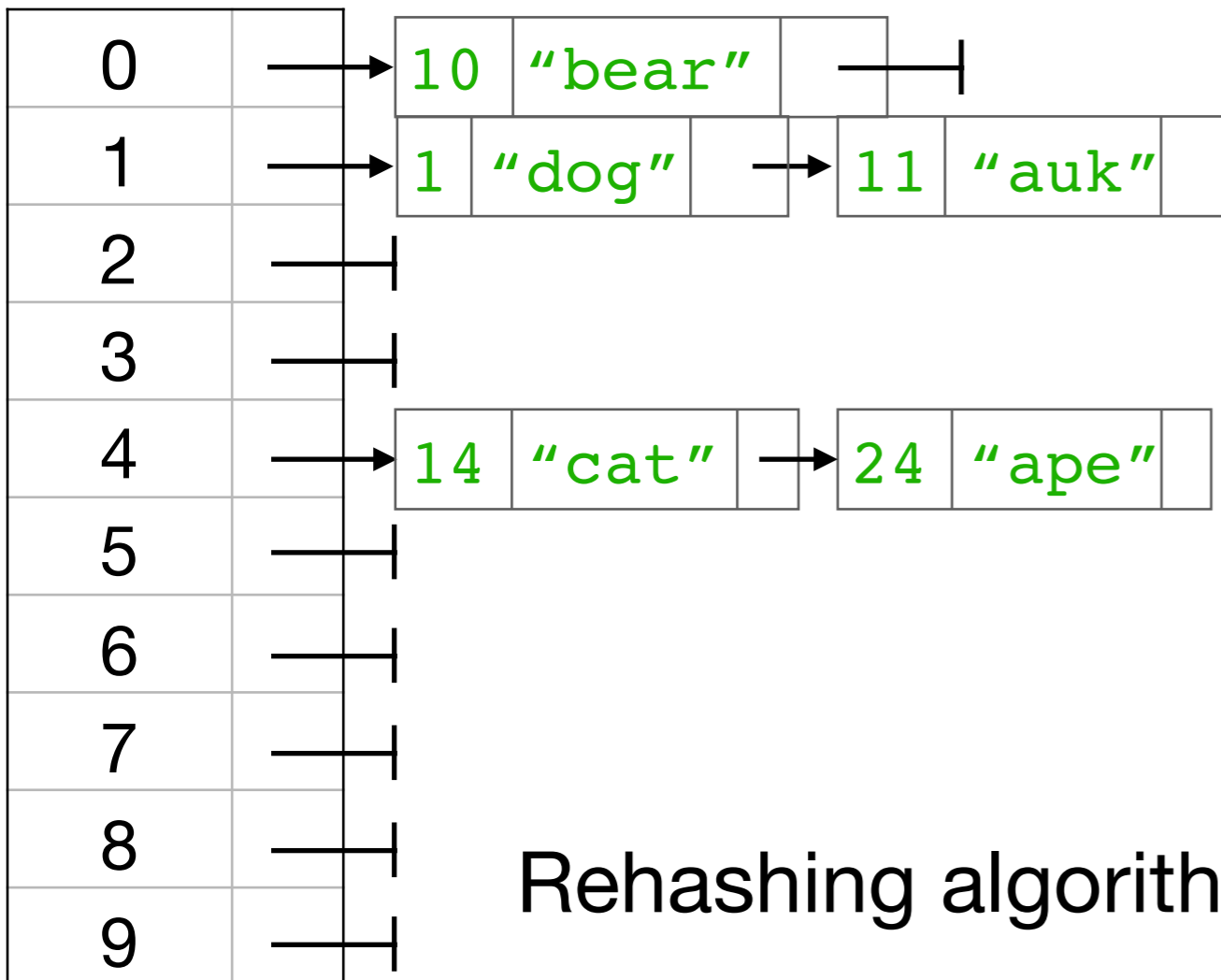
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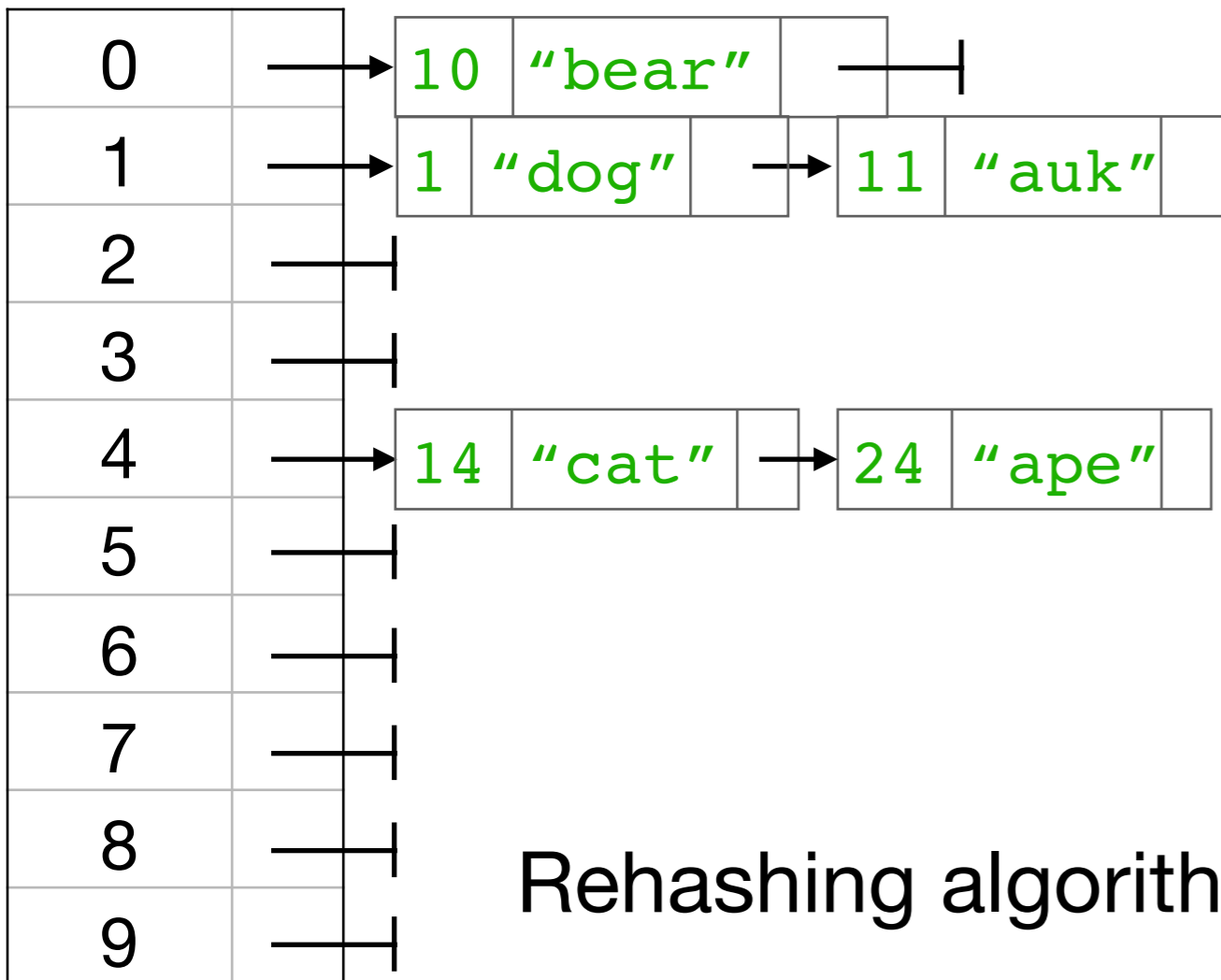
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for each bucket  $b$ :

for each element  $e$  in  $b$ :

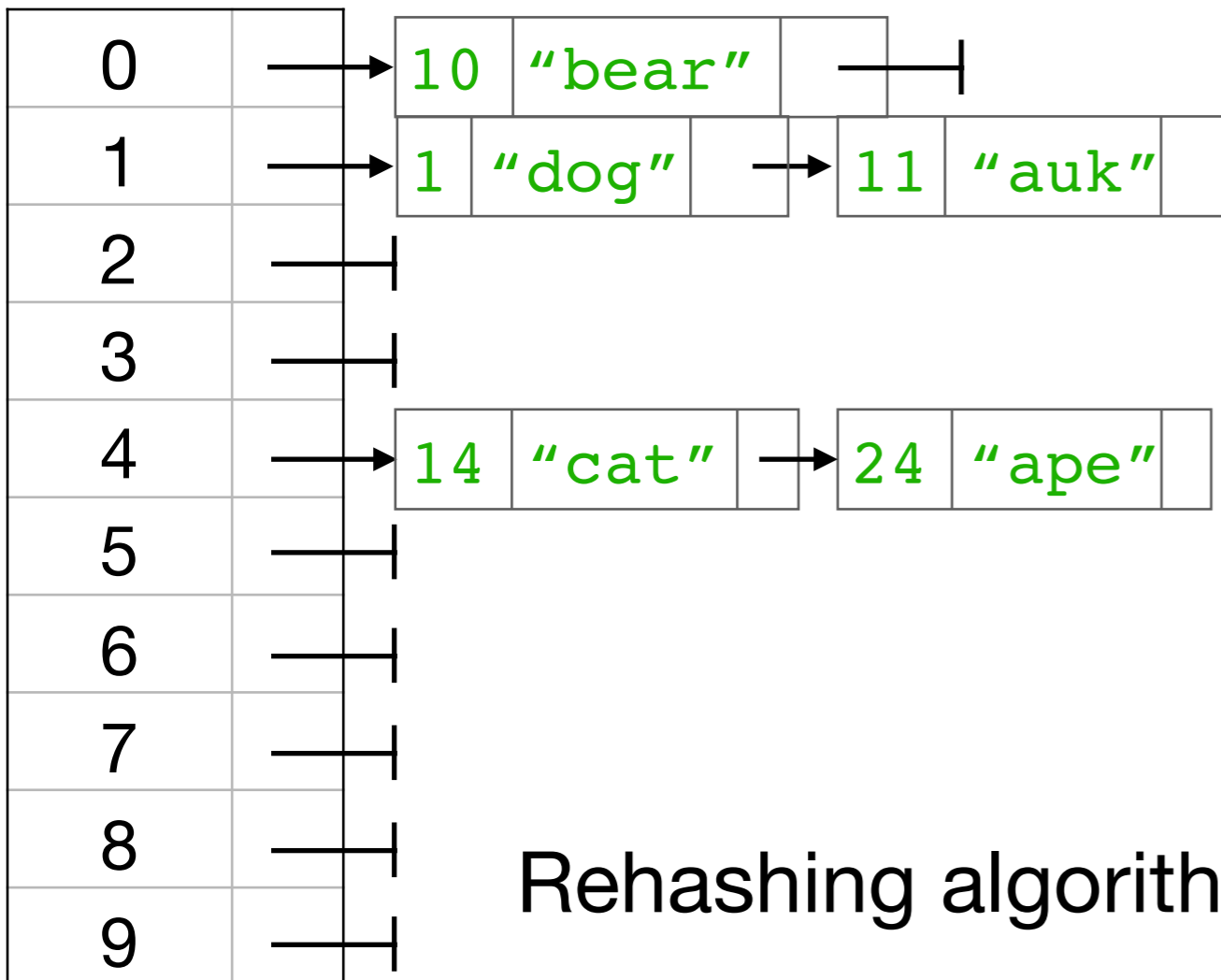
put  $e$  into the new array



# Rehashing: Runtime, take 1

Let  $C$  = array size

Let  $n$  = number of entries



**Overall runtime is:**

- worst-case  $O(C + n^2)$
- average-case  $O(C + n)$

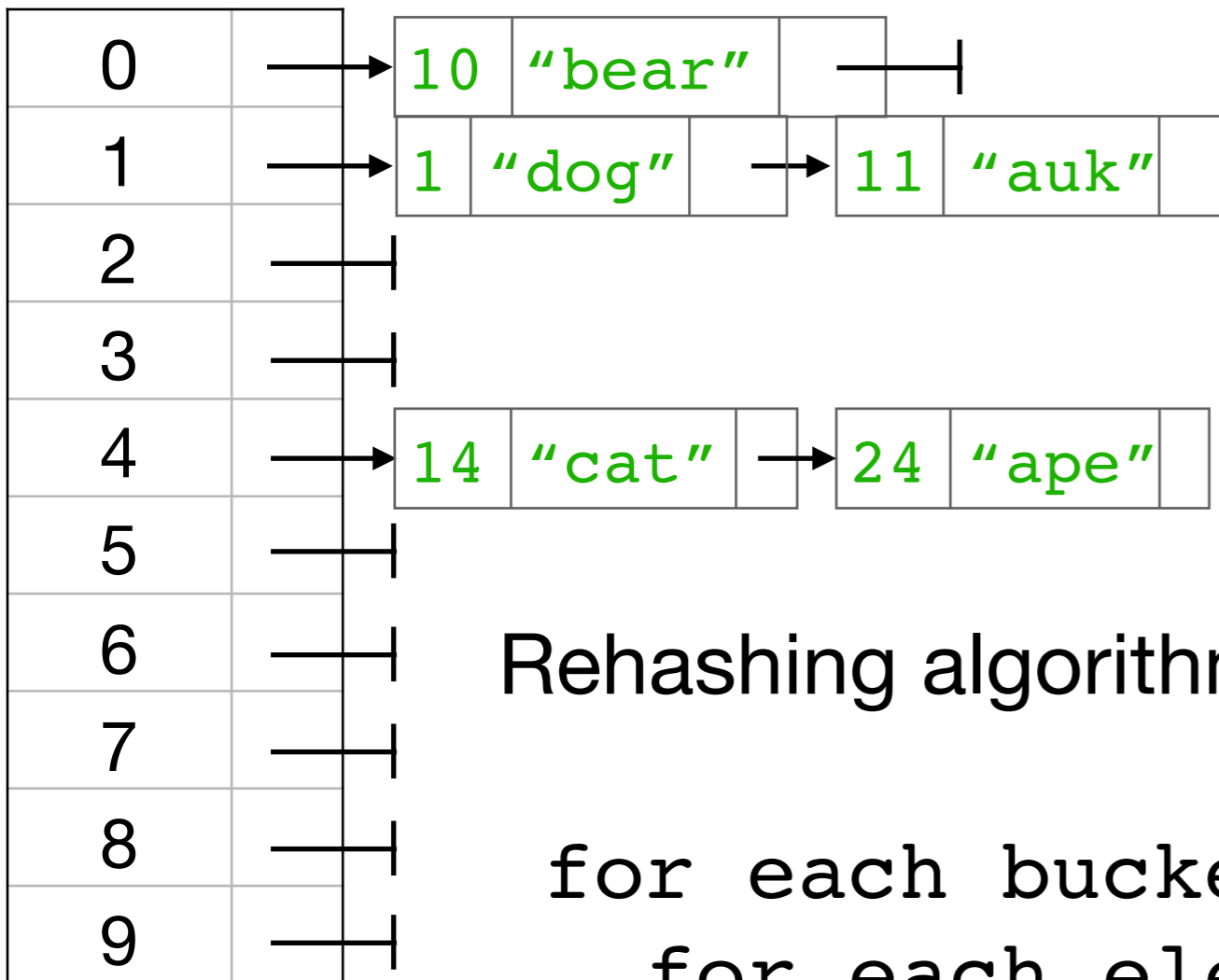
Rehashing algorithm:

visits  $C$  buckets  
 ↓  
 visits  $n$  entries (total)  
 ↓  
 could be  $O(n) =$   
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 for each bucket  $b$ :  
   ↓  
   for each element  $e$  in  $b$ :  
     ↓  
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Let  $C$  = array size

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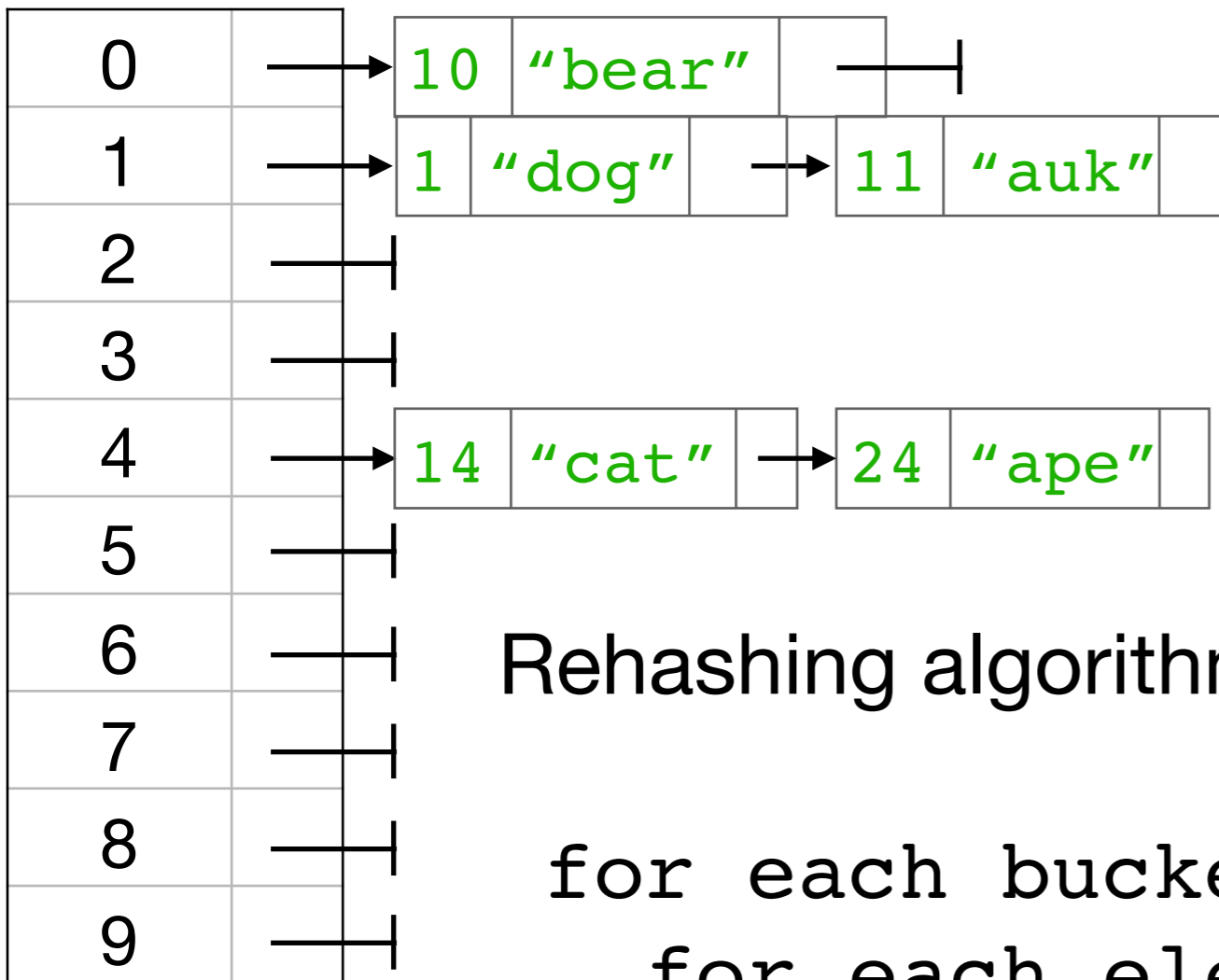
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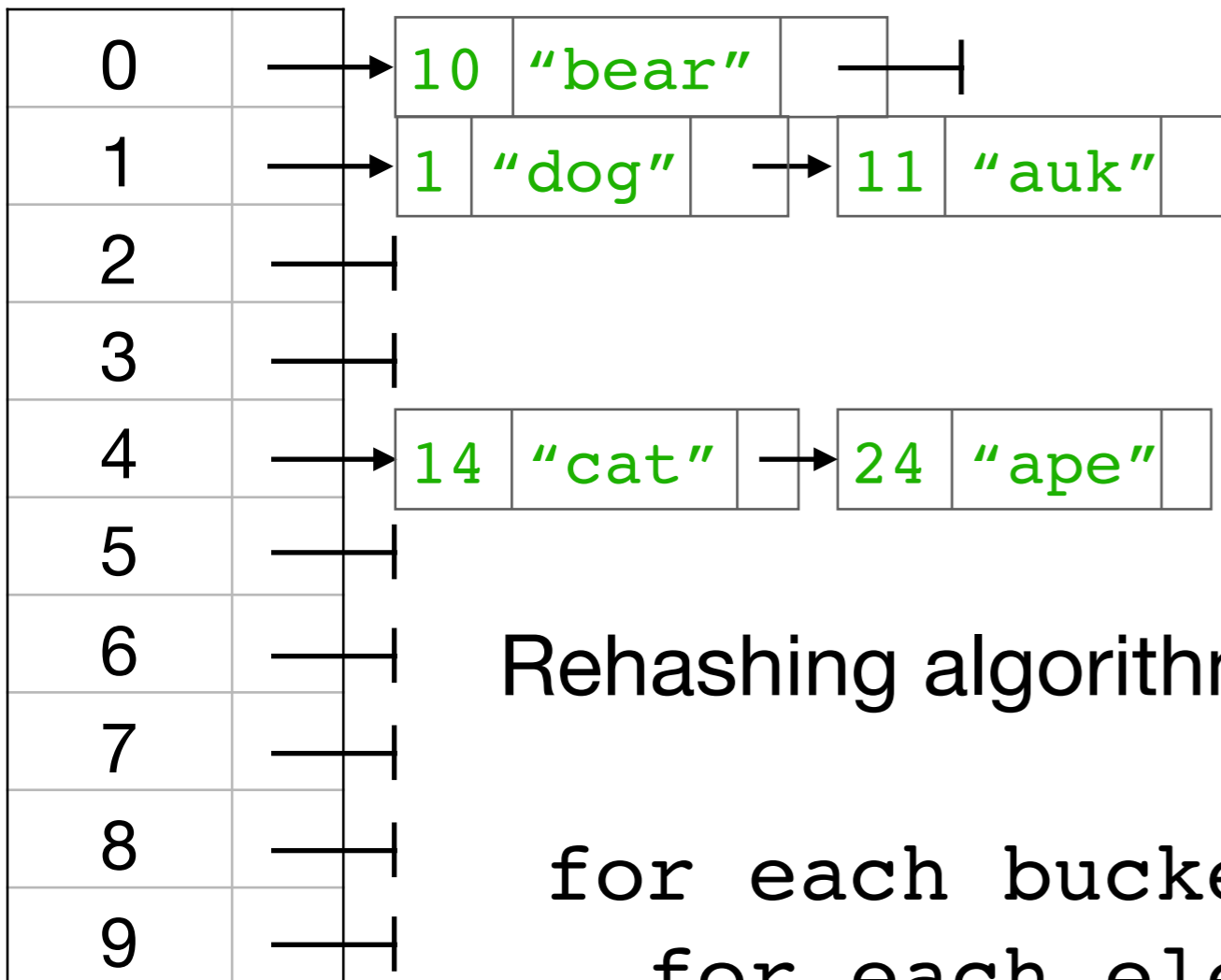
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**could** it be  $O(n)$ ?

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We **can't** have duplicate keys: all  $(k,v)$  pairs were already in the map!  
**Consequence:** we don't need to search the bucket when rehashing

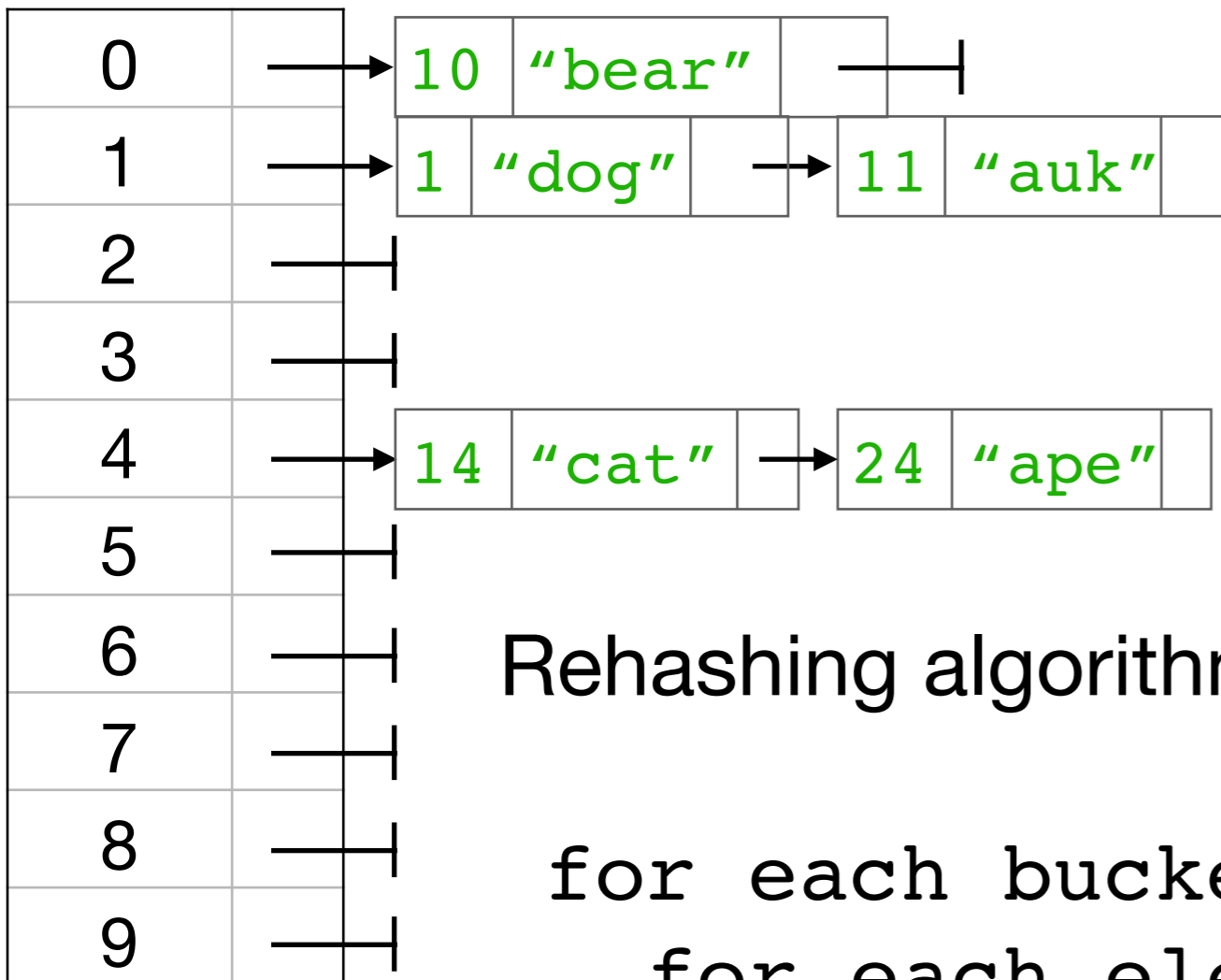
# Rehashing: Runtime, take 1

Let  $C$  = array size

Let  $n$  = number of entries

**Overall runtime is:**

- worst-case  $O(C + n)$



Rehashing algorithm:

for each bucket  $b$ :

for each element  $e$  in  $b$ :

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# Hashing Multiple Integers

- Various heuristic methods:
  - $(a + b + c + d) \% N$
  - $(ak^1 + bk^2 + ck^3 + dk^4) \% N$

# Hashing Strings

- Interpret ASCII (or unicode) representation as an integer.
- Java String uses:  
 $s[0] * 31^{(n-1)} + s[1] * 31^{(n-2)} + \dots + s[n-1]$

# Collision Resolution

- **Chaining** - use a LinkedList to store multiple elements per bucket.
- **Open Addressing** - use empty buckets to store things that belong in other buckets.
  - Need some scheme for deciding which buckets to look in.

# Open Addressing with Linear Probing

- **Open Addressing** - use empty buckets to store things that belong in other buckets.
- Which empty bucket? Using the next empty one is called **Linear Probing**

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

0	
1	
2	
3	
4	

```
put(key):  
    h = hash(key);  
    while A[h] is full:  
        h = (h+1) % N  
    A[h] = value
```



# Open Addressing with Linear Probing

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```

0	
1	(1, dog)
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3	
4	

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# Open Addressing with Linear Probing

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put(14, "cat");  
put(24, "ape");
```

0	(10, bear)
1	(1, dog)
2	(11, auk)
3	
4	

```
put(key):  
    h = hash(key);  
    while A[h] is full:  
        h = (h+1) % N  
    A[h] = value
```

# Open Addressing with Linear Probing

- **Open Addressing** - use empty buckets to store things that belong in other buckets.
- Which empty bucket? Using the next empty one is called **Linear Probing**

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

0	(10, bear)
1	(1, dog)
2	(11, auk)
3	
4	(14, cat)

```
put(key):  
    h = hash(key);  
    while A[h] is full:  
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```
put(key):  
    h = hash(key);  
    while A[h] is full:  
        h = (h+1) % N  
    A[h] = value
```

# Open Addressing with Linear Probing

- Problem with linear probing:
  - Hashing clustered values (e.g., 1, 1, 3, 2, 3, 4, 6, 4, 5) will result in a lot of searching.

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

0	(10, bear)
1	(1, dog)
2	(11, auk)
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```
put(key):  
    h = hash(key);  
    while A[h] is full:  
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    A[h] = value
```

# Open Addressing with Quadratic Probing

- **Quadratic Probing:** Jump further ahead to avoid clustering of full buckets.

Linear probing looks at  $H, H+1, H+2, H+3, H+4, \dots$

Quadratic probing looks at  $H, H+1, H+4, H+9, H+16, \dots$

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

0	(10, bear)
1	(1, dog)
2	(11, auk)
3	(24, ape)
4	(14, cat)

```
put(key):
```

```
    H = hash(key);
```

```
    i = 0;
```

```
    while A[h] is full:
```

```
        h = (H + i2) % N
```

```
        i++;
```

```
    A[h] = value
```

# Open Addressing with Quadratic Probing

- **Quadratic Probing:** Jump further ahead to avoid clustering of full buckets.

Linear probing looks at  $H, H+1, H+2, H+3, H+4, \dots$

Quadratic probing looks at  $H, H+1, H+4, H+9, H+16, \dots$

```
put(1, "dog");  
put(11, "auk");  
put(10, "bear");  
put(14, "cat");  
put(24, "ape");
```

0	(10, bear)
1	(1, dog)
2	(11, auk)
3	(24, ape)
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```
put(key):
```

```
  H = hash(key);
```

```
  i = 0;
```

```
  while A[h] is full:
```

```
    h = (H + i2) % N
```

```
    i++;
```

```
  A[h] = value
```



# Open Addressing with Quadratic Probing

- **Quadratic Probing:** Jump further ahead to avoid clustering of full buckets.

**Exercise:** Which buckets are full after the following insertions into an array size of 10 using quadratic probing?

```
put(0, "ape");
put(1, "dog");
put(20, "elf");
put(21, "auk");
put(40, "bear");
put(41, "cat");
put(60, "elk");
put(61, "imp");
```

```
put(key):
    H = hash(key);
    i = 0;
    while A[h] is full:
        h = (H + i2) % N
        i++;
    A[h] = value
```

# Open Addressing with Quadratic Probing

- **Quadratic Probing:** Jump further ahead to avoid clustering of full buckets.

**Exercise:** Which buckets are full after the following insertions into an array size of 10 using quadratic probing?

```
put(0, "ape");      0
put(1, "dog");     1
put(20, "elf");    0, 1, 4
put(21, "auk");   1, 2
put(40, "bear");  0, 1, 4, 9
put(41, "cat");   1, 2, 5
put(60, "elk");   0, 1, 4, 9, 6
put(61, "imp");   1, 2, 5, 10, 7
```

```
put(key):
    H = hash(key);
    i = 0;
    while A[h] is full:
        h = (H + i2) % N
        i++;
    A[h] = value
```

# Hashing in Java

- Object has a hashCode method.

By default, this returns the object's address in memory.

- It needs to have the properties of a hash function!

1. **Deterministic**: always returns the same value for the same object.
2. **Equal** objects have equal hash codes.

In Java, “equal” means whatever the `equals` method says.

**Consequence:** if you change the definition of `equals` (e.g., by overriding it), you may have to override `hashCode` make sure it's consistent!

# Hashing in Java

**Consequence:** if you override `equals`, you may have to override `hashCode` to match.

```
class Person {
    String firstName;
    String lastName;

    public boolean equals(Person p) {
        return firstName.equals(p.firstName)
            && lastName.equals(p.lastName);
    }

    public int hashCode() {
        return auxHash(firstName)
            + auxHash(lastName);
    }
}
```

# Open Addressing: Runtime

- May be faster, but may not be. Depends on keys.
- There's no free lunch: worst-case is always  $O(n)$ .
- In practice, average-case is  $O(1)$  if you make good design decisions and insertions are not done by an adversary.

# Further Reading

- CLRS 11.5: Perfect Hashing
  - You can guarantee  $O(1)$  lookups and insertions if the set of keys is fixed
- C++ implementations from Google:
  - `sparse_hash_map` - optimized for memory overhead
  - `dense_hash_map` - optimized for speed

# Map and HashMap

- Map is an ADT
- HashMap is an implementation of a Map using a Hash Table.
- TreeMap is a thing too - some of you already wrote one!
  - AVL tree: store a key and a value in each node; BST property applies to **keys** only
    - Example: `TreeMap<String, Integer>` maps words to the number of times they have been seen

# TreeMap vs HashMap

- Runtime of put, get, and remove:
  - TreeMap has  $O(\log n)$  worst and expected
  - HashMap has  $O(1)$  expected,  $O(n)$  worst; better in practice
- Other considerations:
  - TreeMaps enable sorted traversal of keys
  - HashMaps are space-inefficient if load factor is small