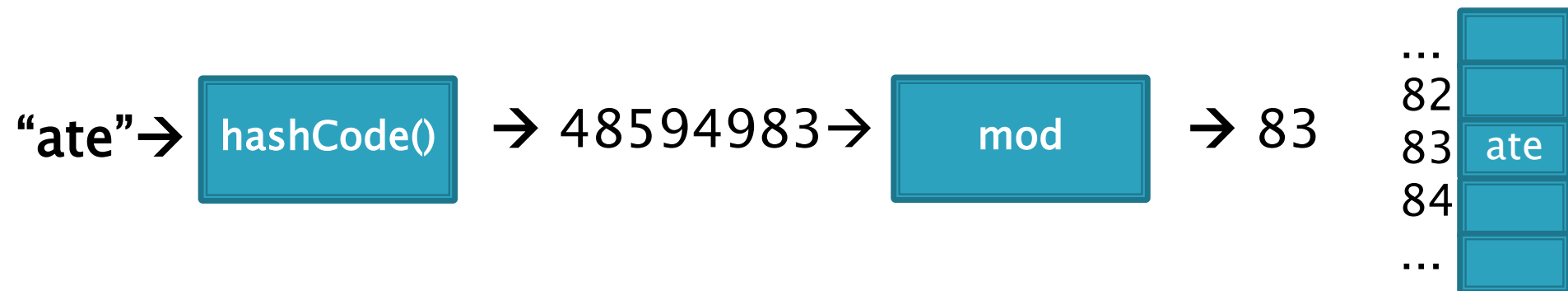


CSSE 230

Hash table basics

After today, you should be able to...
...explain how hash tables perform insertion in amortized $O(1)$ time given enough space



Reminder: Exam 2

- ▶ Topics: weeks 1–6
 - Reading, programs, in–class, written assignments.
 - Especially
 - Algorithm analysis in general
 - Binary trees, including BST, AVL, R/B, and threaded
 - Traversals and iterators, size vs. height, rank
 - Backtracking / Queens problem

- ▶ Questions on this or anything else course–related?

Hashing

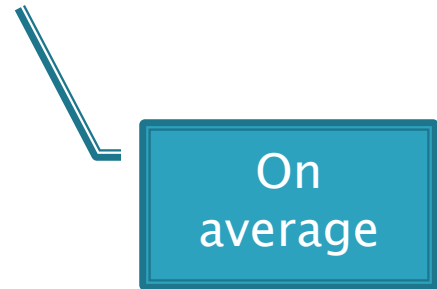
Efficiently putting 5 pounds of
data in a 20 pound bag

Big picture: a map gives dictionary storage

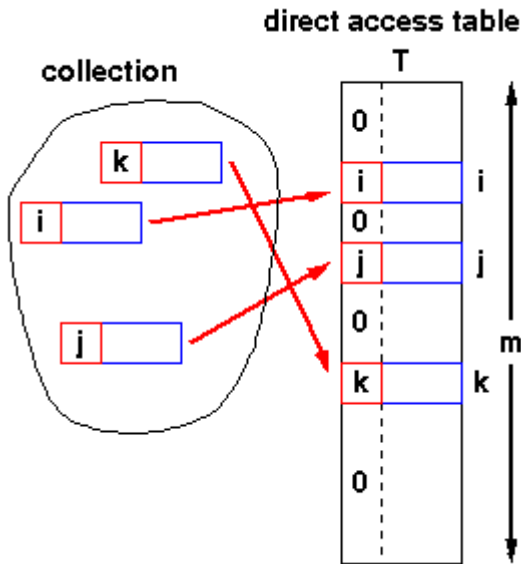
- ▶ Map: insertion, retrieval, and deletion of items by *key*. Examples:
 - `Map<String, Integer> wordCounts;`
 - `Map<Integer, Student> students;`
 - `count = wordCounts.get("best");`
 - `students.add(56423302, new Student(...))`
- ▶ **Implementation choices:**
 - **TreeMap** uses a balanced tree
 - **TreeSet** is a **TreeMap** with no values
 - The BST assignment is an unbalanced **TreeSet**
 - **HashMap** uses a hash table
 - **HashSet** is a **HashMap** with no values

A hash table is a very fast approach to dictionary storage

- ▶ Insertion and lookup are constant time!
 - With a good “hash function”
 - And large enough storage array
- ▶ Doesn't keep items ordered
 - So NOT for sorted data



Direct Address Tables



- ▶ Array of size **m**
- ▶ **n** elements with unique keys
- ▶ If $n \leq m$, then use the key as an array index.
 - Clearly $O(1)$ lookup of keys

▶ Issues?

- Keys must be unique.
- Often the range of potential keys is much larger than the storage we want for an array
 - Example: RHIT student IDs vs. # Rose students

We attempt to create unique keys
by applying a `.hashCode()` function ...



Objects that are `.equals()` **MUST**
have the same `hashCode` values
A good `hashCode()` also
is **fast** to calculate and
distributes the keys, like:

```
hashCode("ate")= 48594983  
hashCode("ape")= 76849201  
hashCode("awe") = 14893202
```

...and then take it mod the table size (m) to get an index into the array.

- ▶ Example: if $m = 100$:

hashCode("ate") = 48594983
hashCode("ape") = 76849201
hashCode("awe") = 1489036



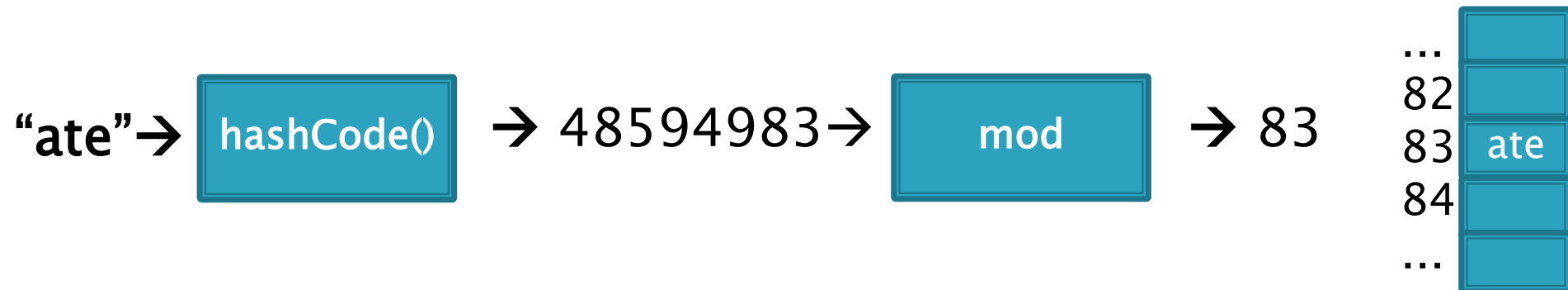
→83

→01

→36

Index calculated from the object itself, not from a comparison with other objects

- ▶ How Java's `hashCode()` is used:



- Unless this position is already occupied

a “collision”

- ▶ Default if you inherit `Object`'s: memory location
- ▶ Many JDK classes override `hashCode()`
 - Integer: the value itself
 - Double: XOR first 32 bits with last 32 bits
 - String: we'll see shortly!
 - Date, URL, ...
- ▶ Custom classes should override `hashCode()`
 - Use a combination of **final** fields.
 - If key is based on mutable field, then the hashcode will change and you will lose it!

A simple hash function for Strings is a function of every character

```
// This could be in the String class
public static int hash(String s) {
    int total = 0;
    for (int i=0; i<s.length(); i++)
        total = total + s.charAt(i);
    return Math.abs(total);
}
```

- ▶ Advantages?
- ▶ Disadvantages?

A better hash function for Strings uses place value

```
// This could be in the String class
public static int hash(String s) {
    int total = 0;
    for (int i=0; i<s.length(); i++)
        total = total*256 + s.charAt(i);
    return Math.abs(total);
}
```

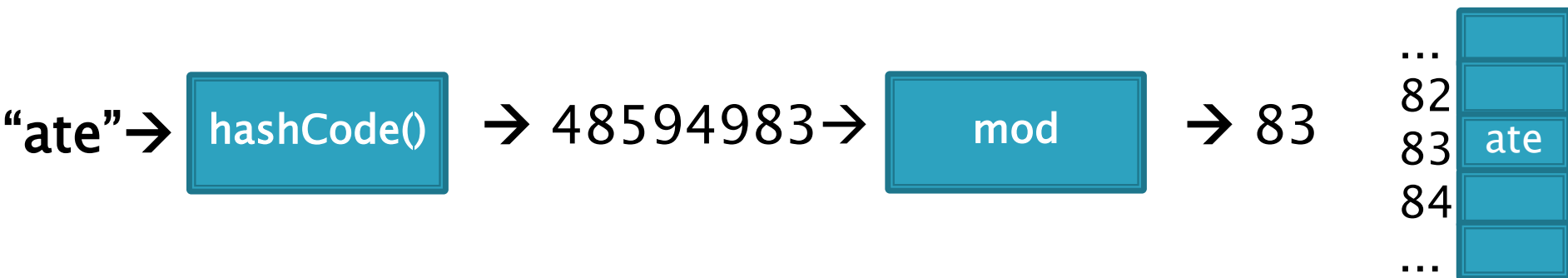
- ▶ Spreads out the values more, and anagrams not an issue.
- ▶ What about overflow during computation?
 - What happens to first characters?

A better hash function for Strings uses place value with a base that's prime

```
// This could be in the String class
public static int hash(String s) {
    int total = 0;
    for (int i=0; i<s.length(); i++)
        total = total*31 + s.charAt(i);
    return Math.abs(total);
}
```

- ▶ Spread out, anagrams OK, overflow OK.
- ▶ This is **String**'s `hashCode()` method.
- ▶ The $(x = 31x + y)$ pattern is a good one to follow.

Collisions are inevitable

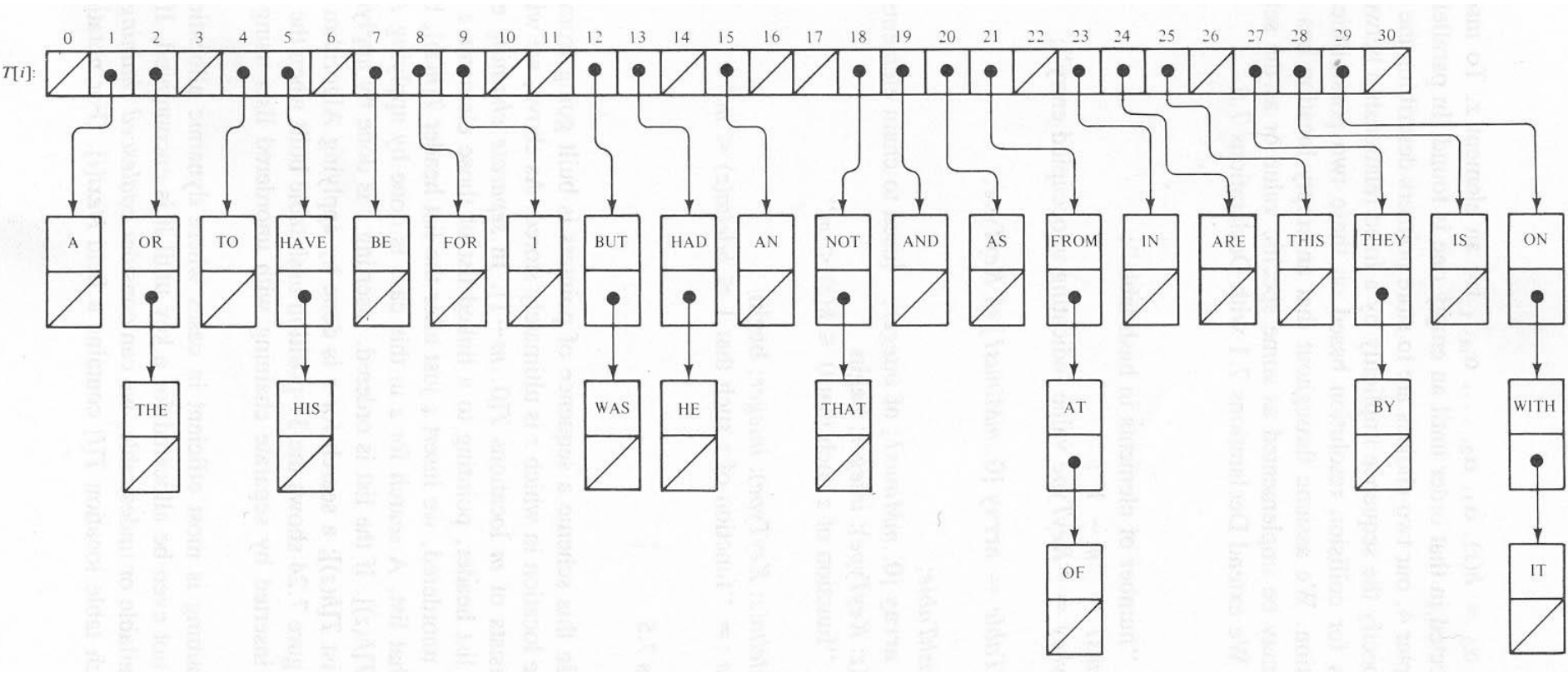


- ▶ A good hashcode distributes keys evenly, but collisions will still happen
- ▶ hashCode() are ints → only ~4 billion unique values.
 - How many 16 character ASCII strings are possible?
- ▶ If n is small, tables should be much smaller
 - mod will cause collisions
- ▶ Solutions:
 - Chaining
 - Probing (Linear, Quadratic)

Separate chaining: an array of linked lists

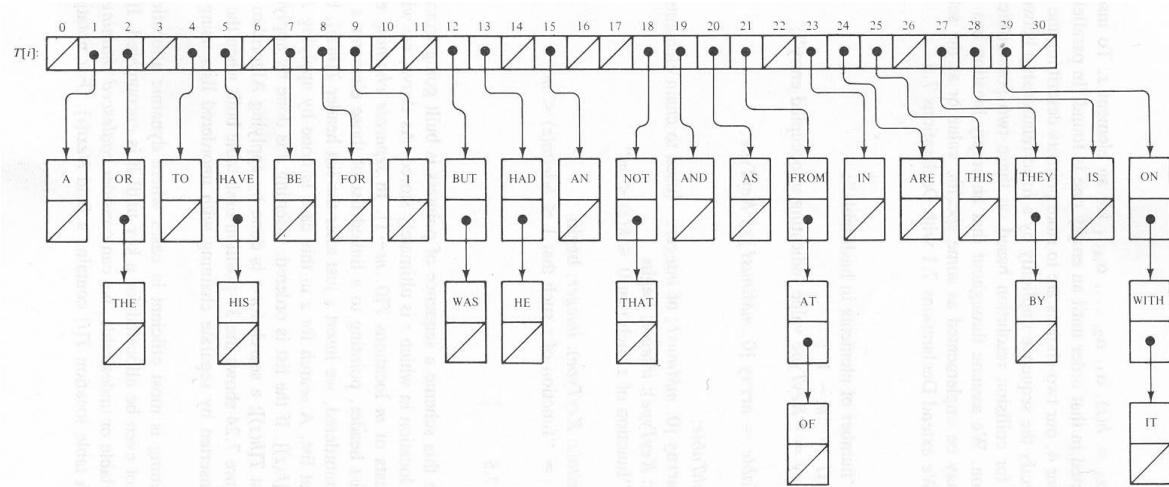
Easy to code
Easy to deal with collisions

Examples: .get("at"), .get("him),
(hashcode=18), .add("him"), .delete("with")



Java's **HashMap** uses chaining and a table size that is a power of 2.

Runtime of hashing with chaining depends on the load factor



m array slots,
n items.

Load factor, $\lambda = n/m$.

Runtime = $O(\lambda)$

Space-time trade-off

1. If m constant, then $O(n)$

2. If keep $m \sim 0.5n$ (by doubling), then **amortized $O(1)$**

Alternative: Store collisions in other array slots.

- ▶ No memory required for pointers
 - Historically, this was important!
- ▶ Will need to keep load factor ($\lambda = n/m$) low or else collisions degrade performance
- ▶ The logic is slightly more complicated
 - And uses some interesting math

Collision Resolution: Linear Probing

- ▶ Probe H (see if it causes a collision)
- ▶ Collision? Also probe the next available space:
 - Try H , $H+1$, $H+2$, $H+3$, ...
 - Wraparound at the end of the array
- ▶ Problem: Clustering
- ▶ Animation:
 - http://www.cs.auckland.ac.nz/software/AlgAnim/has_h_tables.html

```

hash ( 89, 10 ) = 9
hash ( 18, 10 ) = 8
hash ( 49, 10 ) = 9
hash ( 58, 10 ) = 8
hash ( 9, 10 ) = 9

```

After insert 89 *After insert 18* *After insert 49* *After insert 58* *After insert 9*

0			49	49	49
1				58	58
2					9
3					
4					
5					
6					
7					
8		18	18	18	18
9	89	89	89	89	89

Figure 20.4
 Linear probing hash
 table after each
 insertion

Good example
 of clustering
 and wraparound

Linear probing efficiency also depends on load factor, $\lambda = n/m$

- ▶ For probing to work, $0 \leq \lambda \leq 1$.
- ▶ For a given λ , what is the expected number of probes before an empty location is found?

Rough Analysis of Linear Probing

- ▶ Assume all locations are equally likely to be occupied, and equally likely to be the next one we look at.
- ▶ Then the probability that a given cell is full is λ and probability that a given cell is empty is $1-\lambda$.
- ▶ What's the expected number?

$$\sum_{p=1}^{\infty} \lambda^{p-1} (1-\lambda)p = \frac{1}{1-\lambda}$$

Better Analysis of Linear Probing

- ▶ **Clustering!**
 - Blocks of occupied cells are formed
 - Any collision in a block makes the block bigger
- ▶ Two sources of collisions:
 - Identical hash values
 - Hash values that hit a cluster
- ▶ Actual average number of probes for large λ :

$$\frac{1}{2} \left(1 + \frac{1}{(1 - \lambda)^2} \right)$$

For a proof, see Knuth, *The Art of Computer Programming, Vol 3: Searching Sorting*, 2nd ed, Addison-Wesley, Reading, MA, 1998.

Why consider linear probing?

- ▶ Easy to implement
- ▶ Simple code has fast run time per probe
- ▶ Works well when load factor is low
 - In practice, once $\lambda > 0.5$, we usually **double the size of the array** and rehash
 - This is more efficient than letting the load factor get high

To reduce clustering, probe farther apart

- ▶ Linear probing:
 - Collision at H ? Try $H, H+1, H+2, H+3, \dots$
- ▶ Quadratic probing:
 - Collision at H ? Try $H, H+1^2, H+2^2, H+3^2, \dots$
 - Eliminates primary clustering. “Secondary clustering” isn’t as problematic

Quadratic Probing works best with low λ and prime m

- ▶ **Choose a prime number for the array size, m**
- ▶ Then if $\lambda \leq 0.5$:
 - Guaranteed insertion
 - If there is a “hole”, we’ll find it
 - **No cell is probed twice**

For a proof, see Theorem 20.4:

Suppose that we repeat a probe before trying more than half the slots in the table

See that this leads to a contradiction

Contradicts fact that the table size is prime

Quadratic Probing runs quickly if we implement it correctly

- ▶ **Use an algebraic trick to calculate next index**
 - Difference between successive probes yields:
 - Probe i location, $H_i = (H_{i-1} + 2i - 1) \% M$
 - 1. Just use bit shift to multiply i by 2
 - `probeLoc = probeLoc + (i << 1) - 1;`
...faster than multiplication
 - 2. Since i is at most $M/2$, can just check:
 - `if (probeLoc >= M)`
 `probeLoc -= M;`
...faster than mod

Quadratic probing analysis

- ▶ No one has been able to analyze it!
- ▶ Experimental data shows that it works well
 - Provided that the array size is prime, and $\lambda < 0.5$
- ▶ If you are interested, you can do the optional HashSet exercise.
 - <http://www.rose-hulman.edu/class/csse/csse230/201430/InClassExercises/>
- ▶ This week's homework takes a couple questions from there.

Summary:

Hash tables are fast for some operations

Structure	insert	Find value	Find max value
Unsorted array			
Sorted array			
Bal BST			
Hash table			

- ▶ Finish the quiz.
- ▶ Then check your answers with the next slide
- ▶ Then you have worktime

Answers:

Structure	insert	Find value	Find max value
Unsorted array	Amortized $\theta(1)$	$\theta(n)$	$\theta(n)$
Sorted array	$\theta(n)$	$\theta(\log n)$	$\theta(1)$
Bal BST	$\theta(\log n)$	$\theta(\log n)$	$\theta(\log n)$
Hash table	Amortized $\theta(1)$	Amortized $\theta(1)$	$\theta(n)$