

CSC 321: Data Structures

Fall 2018

Hash tables

- HashSet & HashMap
- hash table, hash function
- collisions
 - linear probing, lazy deletion, clustering, rehashing
 - chaining
- Java hashCode method

1

HashSet & HashMap

recall: `TreeSet` & `TreeMap` use an underlying binary search tree (actually, a red-black tree) to store values

- as a result, add/put, contains/get, and remove are $O(\log N)$ operations
- iteration over the Set/Map can be done in $O(N)$

the other implementations of the `Set` & `Map` interfaces, `HashSet` & `HashMap`, use a "magic" data structure to provide $O(1)$ operations*

**legal disclaimer: performance can degrade to $O(N)$ under bad/unlikely conditions
however, careful setup and maintenance can deliver $O(1)$ in practice*

the underlying data structure is known as a *Hash Table*

2

Hash tables

a hash table is a data structure that supports constant time insertion, deletion, and search on average

- degenerative performance is possible, but unlikely
- it may waste some storage
- iteration order is not defined (and may even change over time)

idea: data items are stored in a table, based on a key

- the key is mapped to an index in the table, where the data is stored/accessed

example: letter frequency

- want to count the number of occurrences of each letter in a file
- have an array of 26 counters, map each letter to an index
- to count a letter, map to its index and increment

"A" → 0	1
"B" → 1	0
"C" → 2	3
...	...
"Z" → 25	0

3

Mapping examples

extension: word frequency

- must map entire words to indices, e.g.,

"A" → 0	"AA" → 26	"BA" → 52	...
"B" → 1	"AB" → 27	"BB" → 53	...
...
"Z" → 25	"AZ" → 51	"BZ" → 77...	

- PROBLEM?

mapping each potential item to a unique index is generally not practical

of 1 letter words = 26
of 2 letter words = $26^2 = 676$
of 3 letter words = $26^3 = 17,576$
...

- even if you limit words to at most 8 characters, need a table of size 217,180,147,158
- for any given file, the table will be mostly empty!

4

Table size < data range

since the actual number of items stored is generally MUCH smaller than the number of potential values/keys:

- can have a smaller, more manageable table

e.g., table size = 26

possible mapping: map word based on first letter

"A*" \rightarrow 0 "B*" \rightarrow 1 ... "Z*" \rightarrow 25

e.g., table size = 1000

possible mapping: add ASCII values of letters, mod by 1000

"AB" $\rightarrow 65 + 66 = 131$

"BANANA" $\rightarrow 66 + 65 + 78 + 65 + 78 + 65 = 417$

"BANANABANANABANANA" $\rightarrow 417 + 417 + 417 = 1251 \% 1000 = 251$

- POTENTIAL PROBLEMS?

5

Collisions

the mapping from a key to an index is called a *hash function*

- the hash function can be written independent of the table size
- if it maps to an index > table size, simply wrap-around (i.e., index % tableSize)

since $|\text{range}(\text{hash function})| < |\text{domain}(\text{hash function})|$,
Pigeonhole Principle ensures *collisions* are possible (v_1 & $v_2 \rightarrow$ same index)

"ACT" $\rightarrow 67 + 65 + 84 = 216$

"CAT" $\rightarrow 67 + 65 + 84 = 216$

techniques exist for handling collisions, but they are costly (LATER)

it's best to avoid collisions as much as possible – HOW?

- want to be sure that the hash function distributes the key evenly
- e.g., "sum of ASCII codes" hash function
 - OK if table size is 1000
 - BAD if table size is 10,000most words are ≤ 10 letters, so max sum of ASCII codes = 1,270
so most entries are mapped to first 13% of table

6

Better hash function

a good hash function for words should

- produce an even spread, regardless of table size
- take order of letters into account (to handle anagrams)
- the hash function used by `java.util.String` multiplies the ASCII code for each character by a power of 31

`hashCode() = char0*31(len-1) + char1*31(len-2) + char2*31(len-3) + ... + char(len-1)`

where `len = this.length()`, `chari = this.charAt(i)`:

```
/**
 * Hash code for java.util.String class
 * @return an int used as the hash index for this string
 */
private int hashCode() {
    int hashIndex = 0;

    for (int i = 0; i < this.length(); i++) {
        hashIndex = (hashIndex*31 + this.charAt(i));
    }
    return hashIndex;
}
```

7

Word frequency example

returning to the word frequency problem

- pick a hash function
- pick a table size
- store word & associated count in the table
- as you read in words,
map to an index using the hash function
if an entry already exists, increment
otherwise, create entry with count = 1

0	<table><tr><td>"FOO"</td></tr><tr><td>1</td></tr></table>	"FOO"	1
"FOO"			
1			
1			
2	<table><tr><td>"BAR"</td></tr><tr><td>3</td></tr></table>	"BAR"	3
"BAR"			
3			
	...		
999			

WHAT ABOUT COLLISIONS?

8

Linear probing

linear probing is a simple strategy for handling collisions

- if a collision occurs, try next index & keep looking until an empty one is found (wrap around to the beginning if necessary)

example: assume "first letter" hash function

- insert "BOO", "BAR", "COO", "BOW", ...

linear probing requires "lazy deletion"

- when you delete an item, you can't just empty the location, since it would leave a hole
- subsequent searches would reach that hole and stop probing
- instead, leave a marker (a.k.a a tombstone) in that spot 0 can be overwritten but not skipped when probing

example: given above insertions

- delete "BAR", search for "COO"

0	
1	
2	
3	
4	
	...
25	

9

Clustering and load factor

in practice, probes are not independent

- as the table fills, clusters appear that degrade performance

maps to	0, 5-7 require	1 check
map to	4 requires	2 checks
map to	3 requires	3 checks
map to	2 requires	4 checks
map to	1 requires	5 checks
average	$= 18/8 = 2.25$ checks	

0	
1	"BOO"
2	"BIZ"
3	"COO"
4	"DOG"
5	
6	
7	

the *load factor* λ is the fraction of the table that is full

empty table $\lambda = 0$ half full table $\lambda = 0.5$ full table $\lambda = 1$

THEOREM: assuming a reasonably large table, the average number of locations examined per insertion is roughly $(1 + 1/(1-\lambda)^2)/2$

empty table	$(1 + 1/(1 - 0)^2)/2 = 1$
half full	$(1 + 1/(1 - .5)^2)/2 = 2.5$
3/4 full	$(1 + 1/(1 - .75)^2)/2 = 8.5$
9/10 full	$(1 + 1/(1 - .9)^2)/2 = 50.5$

10

Rehashing

as long as you keep the load factor low (e.g., < 0.75), inserting, deleting and searching a hash table are all $O(1)$ operations

if the table becomes too full, then must resize

- create new table at least twice as big
- just copy over table entries to same locations???
- NO! when you resize, you have to rehash existing entries
new table size \rightarrow new hash function (+ different wraparound)

LET $\text{hashCode} = \text{word.length}()$

ADD "UP"	0	
ADD "OUT"	1	
ADD "YELLOW"	2	
	3	

NOW
RESIZE
AND
REHASH

0	
1	
2	
3	
4	
5	
6	
7	

11

Chaining

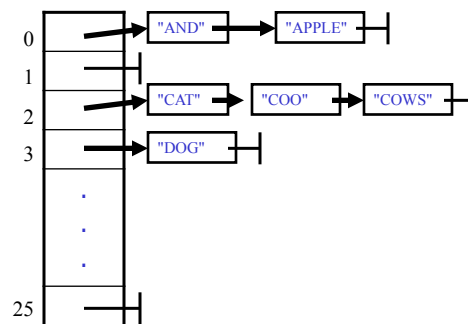
linear probing (or variants) were initially used when memory was expensive

- clustering, lazy deletion, and rehashing are all issues

modern languages like Java utilize a different approach

chaining:

- each entry in the hash table is a bucket (list)
- when you add an entry, hash to correct index then add to bucket
- when you search for an entry, hash to correct index then search sequentially



12

Analysis of chaining

in practice, chaining is generally faster than probing

- cost of insertion is $O(1)$ – simply map to index and add to list
- cost of search is proportional to number of items already mapped to same index
e.g., using naive "first letter" hash function, searching for "APPLE" might require traversing a list of all words beginning with 'A'

if hash function is fair, then average size of each bucket is λ (load factor)
→ average cost of a successful search is roughly $\lambda/2$

chaining is sensitive to the load factor, but not as much as probing – WHY?

chaining uses more memory – WHY?

13

Hashtable class

java.util Class Hashtable<K,V>	
Constructor Summary	
<code>Hashtable()</code>	Constructs a new, empty hashtable with a default initial capacity (11) and load factor (0.75).
<code>Hashtable(int initialCapacity)</code>	Constructs a new, empty hashtable with the specified initial capacity and default load factor (0.75).
<code>Hashtable(int initialCapacity, float loadFactor)</code>	Constructs a new, empty hashtable with the specified initial capacity and the specified load factor.
<code>Hashtable(Map<? extends K,? extends V> m)</code>	Constructs a new hashtable with the same mappings as the given Map.
Method Summary	
<code>void clear()</code>	Clears this hashtable so that it contains no keys.
<code>@SuppressWarnings("unchecked") Object clone()</code>	Creates a shallow copy of this hashtable.
<code>boolean contains(Object value)</code>	Tests if some key maps into the specified value in this hashtable.
<code>boolean containsKey(Object key)</code>	Tests if the specified object is a key in this hashtable.
<code>boolean containsValue(Object value)</code>	Returns true if this hashtable maps one or more keys to this value.
<code>Enumeration<V> elements()</code>	Returns an enumeration of the values in this hashtable.
<code>@SuppressWarnings("unchecked") Set<Map.Entry<K,V>> entrySet()</code>	Returns a <code>Set</code> view of the mappings contained in this map.
<code>boolean equals(Object o)</code>	Compares the specified Object with this Map for equality, as per the definition in the Map interface.
<code>Object get(Object key)</code>	Returns the value to which the specified key is mapped, or <code>null</code> if this map contains no mapping for the key.
<code>int hashCode()</code>	Returns the hash code value for this Map as per the definition in the Map interface.
<code>boolean isEmpty()</code>	Tests if this hashtable maps no keys to values.
<code>Enumeration<K> keys()</code>	Returns an enumeration of the keys in this hashtable.
<code>Set<K> keySet()</code>	Returns a <code>Set</code> view of the keys contained in this map.
<code>Object put(K key, V value)</code>	Maps the specified key to the specified value in this hashtable.
<code>void putAll(Map<? extends K,? extends V> m)</code>	Copies all of the mappings from the specified map to this hashtable.
<code>protected void rehash()</code>	Increases the capacity of and internally reorganizes this hashtable, in order to accommodate and access its entries more efficiently.
<code>V remove(Object key)</code>	Removes the key (and its corresponding value) from this hashtable.
<code>int size()</code>	Returns the number of keys in this hashtable.
<code>String toString()</code>	Returns a string representation of this hashtable object in the form of a set of entries, enclosed in braces and separated by the ASCII characters ' ', ' ' (comma and space).

Java provides a basic hash table implementation

- utilizes chaining
- can specify the initial table size & threshold for load factor
- can even force a rehashing

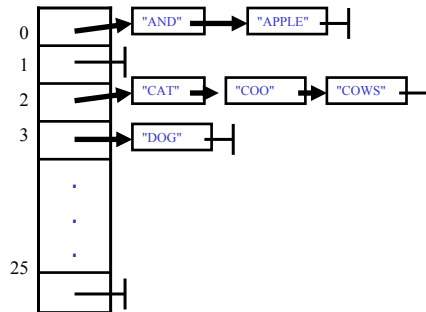
not commonly used, instead provides underlying structure for HashSet & HashMap

14

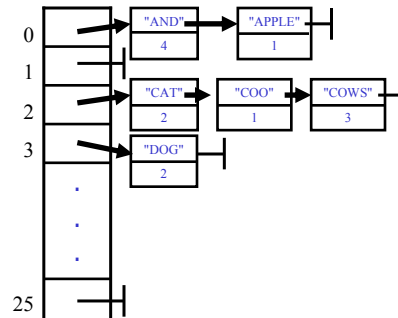
HashSet & HashMap

`java.util.HashSet` and `java.util.HashMap` use hash table w/ chaining

▪ e.g., `HashSet<String>`



`HashMap<String, Integer>`



- defaults: table size = 16, max capacity before rehash = 75%
can override these defaults in the HashSet/HashMap constructor call

note: iterating over a HashSet or HashMap is: $O(\text{num stored} + \text{table size})$ WHY?

15

Word frequencies (again)

using HashMap instead of TreeMap

- `containsKey`, `get` & `put` operations are all $O(1)^*$
- however, iterating over the `keySet` (and their values) does not guarantee any order
- if you really care about speed \rightarrow use `HashSet/HashMap`
- if the data/keys are comparable & order matters \rightarrow use `TreeSet/TreeMap`

```
import java.util.Map;
import java.util.HashMap;
import java.util.Scanner;
import java.io.File;

public class WordFreq {
    private Map<String, Integer> words;

    public WordFreq() {
        words = new HashMap<String, Integer>();
    }

    public WordFreq(String filename) {
        this();
        try {
            Scanner infile = new Scanner(new File(filename));
            while (infile.hasNext()) {
                String nextWord = infile.next();
                this.add(nextWord);
            }
        } catch (java.io.FileNotFoundException e) {
            System.out.println("FILE NOT FOUND");
        }
    }

    public void add(String newWord) {
        String cleanWord = newWord.toLowerCase();
        if (words.containsKey(cleanWord)) {
            words.put(cleanWord, words.get(cleanWord)+1);
        } else {
            words.put(cleanWord, 1);
        }
    }

    public void showAll() {
        for (String str : words.keySet()) {
            System.out.println(str + ": " + words.get(str));
        }
    }
}
```

16

hashCode function

```
import java.util.Calendar;
import java.util.GregorianCalendar;

public class Person {
    private String firstName, lastName;
    private Calendar birthday;

    public Person(String fname, String lname, int month, int day, int year) {
        this.firstName = fname;
        this.lastName = lname;
        this.birthday = new GregorianCalendar(year, month-1, day);
    }

    public String toString() {
        return this.firstName + " " + this.lastName + "; " +
            (this.birthday.get(Calendar.MONTH)+1) + "/" +
            this.birthday.get(Calendar.DAY_OF_MONTH) + "/" +
            this.birthday.get(Calendar.YEAR);
    }

    ///////////////////////////////////////////////////

    public static void main(String[] args) {
        Person p1 = new Person("Chris", "Marlowe", 5, 25, 1992);
        System.out.println(p1);
        System.out.println(p1.hashCode());

        Person p2 = new Person("Alex", "Cooper", 2, 5, 1994);
        System.out.println(p2);
        System.out.println(p2.hashCode());

        Person p3 = new Person("Pat", "Phillips", 2, 5, 1994);
        System.out.println(p3);
        System.out.println(p3.hashCode());
    }
}
```

a default hash
function is
defined for every
Object

- uses *native* code to access & return the address of the object

```
run:
Chris Marlowe: 5/25/1992
424201356
Alex Cooper: 2/5/1994
2053965899
Pat Phillips: 2/5/1994
205238968
BUILD SUCCESSFUL (total time: 0 seconds)
```

17

overriding hashCode v.1

```
import java.util.Calendar;
import java.util.GregorianCalendar;

public class Person {
    private String firstName, lastName;
    private Calendar birthday;

    public Person(String fname, String lname, int month, int day, int year) {
        this.firstName = fname;
        this.lastName = lname;
        this.birthday = new GregorianCalendar(year, month-1, day);
    }

    public String toString() {
        return this.firstName + " " + this.lastName + "; " +
            (this.birthday.get(Calendar.MONTH)+1) + "/" +
            this.birthday.get(Calendar.DAY_OF_MONTH) + "/" +
            this.birthday.get(Calendar.YEAR);
    }

    public int hashCode() {
        return Math.abs((int)this.birthday.getTimeInMillis());
    }

    ///////////////////////////////////////////////////

    public static void main(String[] args) {
        Person p1 = new Person("Chris", "Marlowe", 5, 25, 1992);
        System.out.println(p1);
        System.out.println(p1.hashCode());

        Person p2 = new Person("Alex", "Cooper", 2, 5, 1994);
        System.out.println(p2);
        System.out.println(p2.hashCode());

        Person p3 = new Person("Pat", "Phillips", 2, 5, 1994);
        System.out.println(p3);
        System.out.println(p3.hashCode());
    }
}
```

can override
hashCode if more
class-specific
knowledge helps

1. must consistently map the same object to the same index
2. must map equal objects to the same index

```
run:
Chris Marlowe: 5/25/1992
1899603840
Alex Cooper: 2/5/1994
218788608
Pat Phillips: 2/5/1994
218788608
```

18

overriding hashCode v.2

```
import java.util.Calendar;
import java.util.GregorianCalendar;

public class Person {
    private String firstName, lastName;
    private Calendar birthday;

    public Person(String fName, String lName, int month, int day, int year) {
        this.firstName = fName;
        this.lastName = lName;
        this.birthday = new GregorianCalendar(year, month-1, day);
    }

    public String toString() {
        return this.firstName + " " + this.lastName + ": " +
            (this.birthday.get(Calendar.MONTH)+1) + "/" +
            this.birthday.get(Calendar.DAY_OF_MONTH) + "/" +
            this.birthday.get(Calendar.YEAR);
    }

    public int hashCode() {
        return Math.abs((int)this.birthday.getTimeInMillis() +
            (this.firstName+this.lastName).hashCode());
    }
}

////////////////////////////////////

public static void main(String[] args) {
    Person p1 = new Person("Chris", "Marlowe", 5, 25, 1992);
    System.out.println(p1);
    System.out.println(p1.hashCode());

    Person p2 = new Person("Alex", "Cooper", 2, 5, 1994);
    System.out.println(p2);
    System.out.println(p2.hashCode());

    Person p3 = new Person("Pat", "Phillips", 2, 5, 1994);
    System.out.println(p3);
    System.out.println(p3.hashCode());
}
```

to avoid birthday collisions, can also incorporate the names

- utilize the String hashCode method

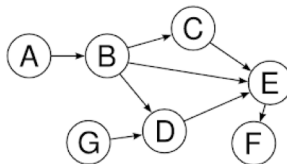
```
run:
Chris Marlowe: 5/25/1992
413568008
Alex Cooper: 2/5/1994
520715368
Pat Phillips: 2/5/1994
9438334
```

19

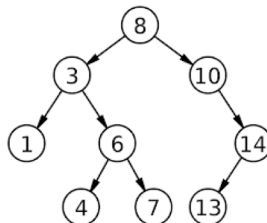
Graphs (sneak peek)

trees are special instances of the more general data structure: graphs

- informally, a graph is a collection of nodes/data elements with connections



a tree is a graph in which one node has no edges coming into it (the root) and no cycles



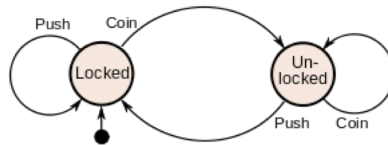
20

Finite State Machines (FSMs)

many useful problems can be defined using simple graphs

- a *Finite State Machine* (a.k.a. *Finite Automaton*) defines a finite set of states (i.e., nodes) along with transitions between those states (i.e., edges)

e.g., the logic controlling a coin-operated turnstile



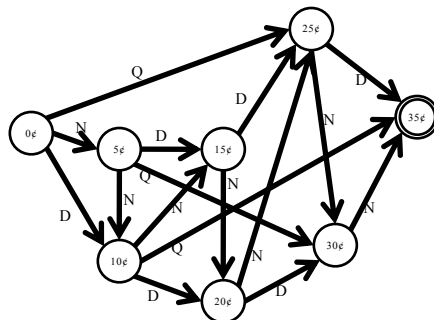
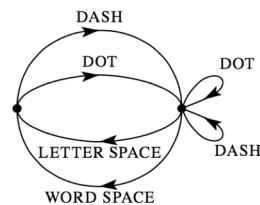
can be in one of two states: locked or unlocked

- if locked,
 - pushing → it does not allow passage & stays locked
 - inserting coin → unlocks it
- if unlocked,
 - pushing → allows passage & then relocks
 - inserting coin → keeps it unlocked

21

Other examples

Claude Shannon used a
FSM to show constraints on
Morse code

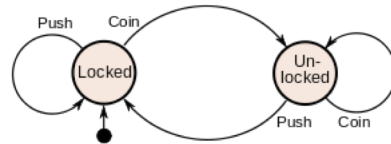


can use a FSM to specify the
behavior of a vending
machine

adding a coin (Q, D, N) changes the
state

22

HW6: Simulate a FSM



locked push locked
 locked coin unlocked
 unlocked push locked
 unlocked coin unlocked

model a FSM by storing the edges and providing lookup methods

```
private HashMap<StateLabel, HashMap<EdgeLabel, StateLabel>> table;
```

locked	coin	unlocked
	push	locked
unlocked	coin	unlocked
	push	locked

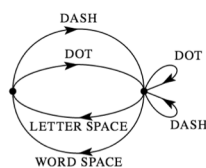
the *key* to the table is the start state of an edge
 the *value* is another map, which maps edge labels to the end states

```
table.get("locked") →  
a map containing edges from "locked"
```

```
table.get("locked").get("coin") →  
"unlocked"
```

23

HW6: Other examples



```
inLetter . inLetter  

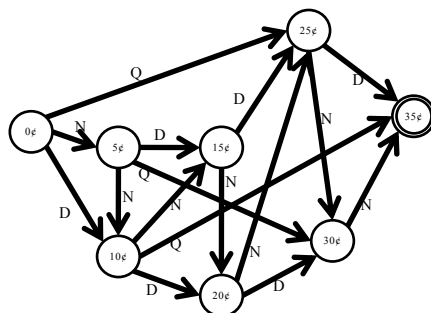
inLetter - inLetter  

inLetter _ betweenLetters  

inLetter __ betweenLetters  

betweenLetters . inLetter  

betweenLetters - inLetter
```



```
0cents N 5cents  

0cents D 10cents  

0cents Q 25cents  

5cents N 10cents  

5cents D 15cents  

5cents Q 30cents  

10cents N 15cents  

10cents D 20cents  

10cents Q 35cents  

15cents N 20cents  

15cents D 25cents  

20cents N 25cents  

20cents D 30cents  

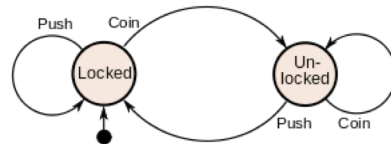
25cents N 30cents  

25cents D 35cents  

30cents N 35cents
```

24

HW6: PathTracer



```

locked push locked
locked coin unlocked
unlocked push locked
unlocked coin unlocked
  
```

given a start state and sequence of edges, determine the end state

```

Enter FSM file: turnstile.txt

Enter a start state (* to end): locked
Enter an edge sequence (separated with whitespace): coin push
End state: locked

Enter another start state (* to end): locked
Enter an edge sequence (separated with whitespace): push coin push push coin
End state: unlocked

Enter another start state (* to end): *
DONE
  
```

25

HW6: PathFinder

you are given a method that finds a shortest path between to states

```
fsm.findPath("0cents", "35cents") → ["0cents", "10cents", "35cents"]
```

- you will write a driver class that repeatedly finds and prints paths

```

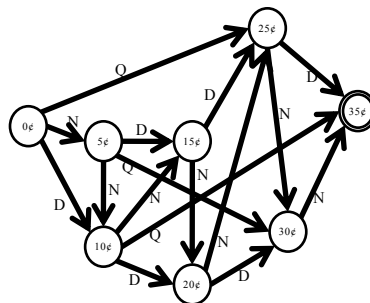
Enter FSM file: change.txt

Enter a start state (* to end): 0cents
Enter the end state: 35cents
State path: [0cents, 10cents, 35cents]

Enter another start state (* to end): 5cents
Enter the end state: 20cents
State path: [5cents, 10cents, 20cents]

Enter another start state (* to end): 10cents
Enter the end state: 5cents
No SUCH PATH

Enter another start state (* to end): *
DONE
  
```



26