

# Outline

1 Hashing



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- Equality test: method for checking whether two keys are equal
- Collision resolution: algorithm and data structure to handle two keys that hash to the same array index

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#### Classic space-time tradeoff

- No space limitation: trivial hash function with key as index
- No time limitation: trivial collision resolution with sequential search
- Space and time limitations: hashing (the real world)



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Practical challenge: need different approach for each type of key



#### Java's hash code conventions

- All Java classes inherit a method hashCode(), which returns a 32-bit int
- Requirement: if x.equals(y), then x.hashCode() == y.hashCode()
- Highly desirable: if !x.equals(y), then x.hashCode() != y.hashCode()
- ullet Default implementation: return memory address of  $_{x}$
- Legal (but poor) implementation: always return 17
- Customized implementations: Integer, Double, String, File, URL, Date, ...
- User-defined types: users are on their own



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public final class Boolean {
   private final boolean value;
   public int hashCode() { return value ? 1231 : 1237; }
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public final class Double {
   private final double value;

   public int hashCode() {
      long bits = doubleToLongBits(value);
      return (int) (bits ^ (bits >>> 32));
   }
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```
public final class String {
   private int hash = 0;
   private final char[] s;

public int hashCode() {
    if (hash != 0) { return hash; }
     for (int i = 0; i < length(); i++) { hash = s[i] + (31 * hash); }
     return hash;
   }
}</pre>
```



# Implementing hash code for user-defined types

```
public final class Transaction implements Comparable<Transaction> {
   private final String who;
   private final Date when;
   private final double amount;

public int hashCode() {
     int hash = 17;
     hash = 31 * hash + who.hashCode();
     hash = 31 * hash + when.hashCode();
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# Hash code design

- ullet Combine each significant field using the 31x+y rule
- If field is a primitive type, use wrapper type hashCode()
- If field is null, return 0
- If field is a reference type, use hashCode()
- If field is an array, apply to each entry



Modular hashing

- Hash code: an  $_{\mathrm{int}}$  between  $-2^{31}$  and  $2^{31}-1$
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Example (hash value frequencies for words in Tale of Two Cities; 10,679 keys;  $\emph{m}=97$ )



#### Modular hashing

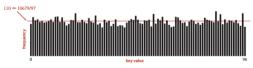
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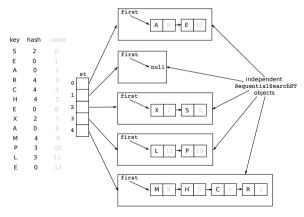
Collision: two distinct kevs hash to the same index

- Can't avoid collisions unless you have a ridiculous amount of memory
- Collisions are evenly distributed
- Challenge: deal with collisions efficiently



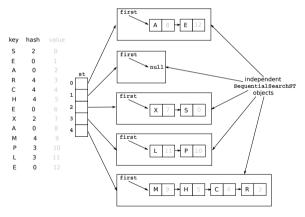
Use an array of m < n linked lists

- ullet Hash: map key to integer  $i \in [0,m-1]$
- Insert: put at front of *i*th chain (if not already there)
- Search: need to search only the *i*th chain



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The ratio n/m is called the load factor and is denoted by  $\alpha$ , and is interpreted as the average number of keys per list



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- Halve the size of array when  $\alpha \leq 2$
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The cost of search, insert, and delete, under the uniform hashing assumption, is constant (between 3 and 5)



```
☑ SeparateChainingHashST.java

package dsa:
import stdlib.StdIn;
import stdlib.StdOut:
public class SeparateChainingHashST<Kev, Value> implements BasicST<Kev, Value> {
    private LinearSearchST < Key, Value > [] st;
    private int m:
    private int n:
    public SeparateChainingHashST() {
        this (4);
    public SeparateChainingHashST(int m) {
        this.m = m;
        st = (LinearSearchST < Kev. Value > []) new LinearSearchST [m]:
        for (int i = 0: i < m: i++) {
             st[i] = new LinearSearchST < Key, Value > ():
    public boolean isEmpty() {
        return size() == 0;
    public int size() {
        return n:
    public void put(Key key, Value value) {
        if (kev == null) {
             throw new IllegalArgumentException("key is null");
        if (value == null) {
```

```
☑ SeparateChainingHashST.java

            throw new IllegalArgumentException("value is null"):
        if (n >= 10 * m) {
            resize(2 * m):
        int i = hash(kev):
        if (!st[i].contains(key)) {
            n++:
        st[i].put(key, value);
    public Value get(Key key) {
        if (key == null) {
            throw new IllegalArgumentException("key is null");
        int i = hash(kev):
        return st[i].get(key);
    public boolean contains (Kev kev) {
        if (kev == null) {
            throw new IllegalArgumentException("kev is null"):
        return get(kev) != null:
    public void delete(Kev kev) {
        if (kev == null) {
            throw new IllegalArgumentException("kev is null"):
        int i = hash(kev):
        if (st[i].contains(kev)) {
            n--:
```

```
☑ SeparateChainingHashST.java

        st[i].delete(kev):
        if (m > 4 & k n \le 2 * m) {
            resize(m / 2);
    public Iterable < Key > keys() {
        LinkedQueue < Key > queue = new LinkedQueue < Key > ():
        for (LinearSearchST<Kev, Value> chain : st) {
             for (Key key : chain.keys()) {
                 queue . enqueue (kev):
        return queue;
    private int hash(Kev kev) {
        return (kev.hashCode() & 0x7ffffffff) % m:
    private void resize(int chains) {
        SeparateChainingHashST<Kev, Value> temp = new SeparateChainingHashST<Kev, Value>(chains);
        for (LinearSearchST<Kev, Value> chain : st) {
             for (Kev kev : chain.kevs()) {
                 temp.put(key, chain.get(key));
        this.m = temp.m:
        this.n = temp.n:
        this.st = temp.st:
    public static void main(String[] args) {
        SeparateChainingHashST < String . Integer > st = new SeparateChainingHashST < String . Integer > ():
        for (int i = 0: !StdIn.isEmptv(): i++) {
```

```
String key = StdIn.readString();
    st.put(key, i);
for (String s : st.keys()) {
    StdOut.println(s + " " + st.get(s));
```