Class 09 - Hashing

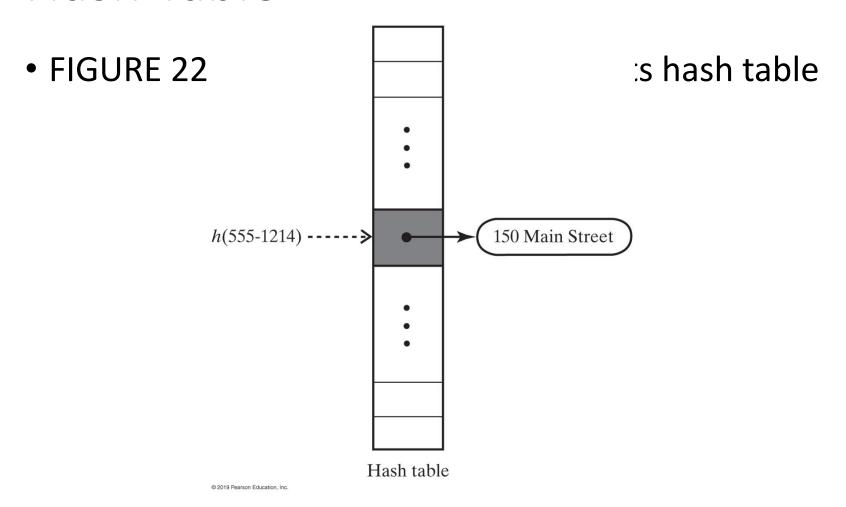
CSIS 3475 Data Structures and Algorithms

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Hashing

- A technique that determines an index into a table using only an entry's search key
- Hash function
 - Takes a search key and produces the integer index of an element in the hash table
 - Search key is mapped, or hashed, to the index

Hash Table



Ideal Hashing

 Simple algorithms for the dictionary operations that add and retrieve

Algorithm add(key, value)

index = h(key)
hashTable[index] = value

Algorithm getValue(key)

index = h(key)

return hashTable[index]

Typical Hashing

- Typical hash functions perform two steps:
 - Convert search key to an integer
 - Called the hash code.
 - Compress hash code into the range of indices for hash table.

Algorithm getHashIndex(phoneNumber)

```
// Returns an index to an array of tableSize elements.
```

i = last four digits of phoneNumber

return i % tableSize

Typical Hashing

- Most hash functions are not perfect,
 - Can allow more than one search key to map into a single index
 - Causes a collision in the hash table
- Consider tableSize = 101
- getHashIndex(555-1214) = 52
- getHashIndex (555-8132) = 52 also!!!

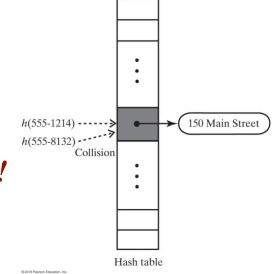


FIGURE 22-2 A collision caused by the hash function *h*

Hash Functions

- A good hash function should
 - Minimize collisions
 - Be fast to compute
- To reduce the chance of a collision
 - Choose a hash function that distributes entries uniformly throughout hash table.

Computing Hash Codes

- Java's base class Object has a method
 hashCode that returns an integer hash code
 - A class should/could define its own version of hashCode
- A hash code for a string
 - Using a character's Unicode integer is common
 - O Better approach:
 - Multiply Unicode value of each character by factor based on character's position,
 - Then sum values

Computing Hash Codes

Hash code for a string example:

$$u_0g^{n-1} + u_1g^{n-2} + ... + u^{n-2}g + u_{n-1}$$

Java code to do this:

```
int hash = 0;
int n = s.length();
for (int i = 0; i < n; i++)
  hash = g * hash + s.charAt(i);</pre>
```

Hash Code for a Primitive type

- If data type is int,
 - Use the key itself
- For byte, short, char:
 - o Cast as int
- Other primitive types
 - Manipulate internal binary representations

Compressing a Hash Code

- Common way to scale an integer
 Use Java mod operator %: code % n
- Best to use an odd number for n
- Prime numbers often give good distribution of hash values

Compressing a Hash Code

Hash function for the ADT dictionary

Resolving Collisions

Collision:

 Hash function maps search key into a location in hash table already in use

Two choices:

- Use another location in the hash table
- Change the structure of the hash table so that each array location can represent more than one value

Resolving Collisions

Linear probing

- Resolves a collision during hashing by examining consecutive locations in hash table
- Beginning at original hash index
- Find the next available one
- Table locations checked make up probe sequence
- If probe sequence reaches end of table, go to beginning of table (circular hash table)

Linear Probing

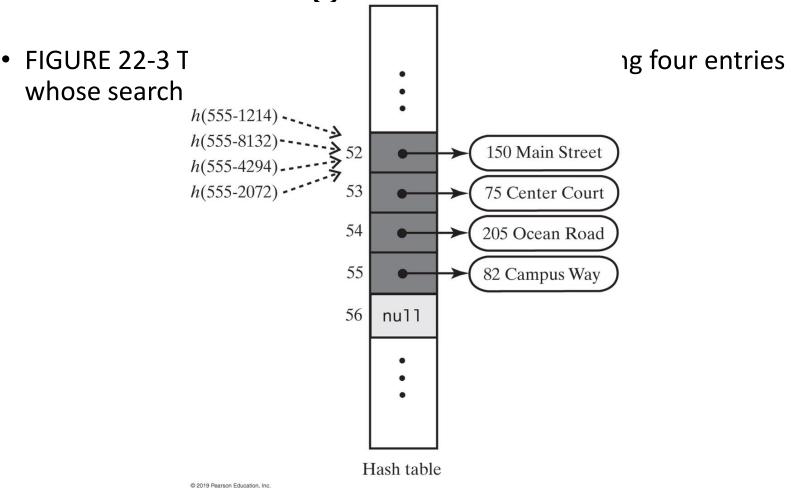
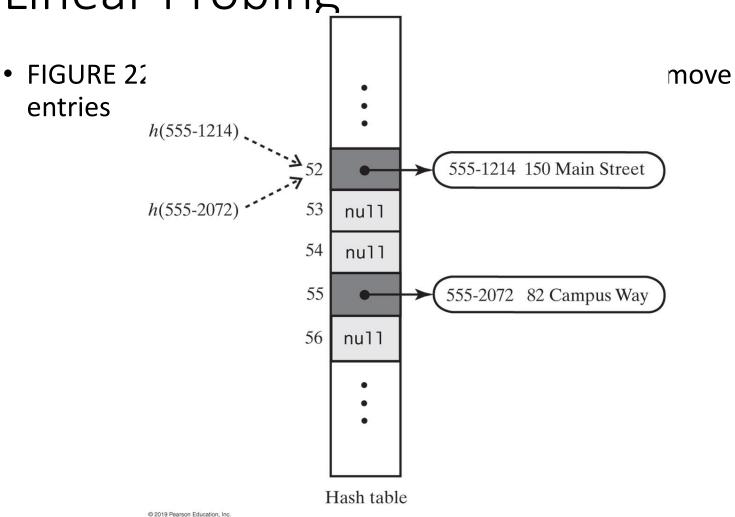


FIGURE 22-3 The effect of linear probing after adding four entries whose search keys hash to the same index

Linear Probing



Resolving Collisions

Need to distinguish among three kinds of locations in the hash table

Occupied

location references an entry in the dictionary

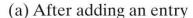
○ Empty

location contains null and always has

O Available

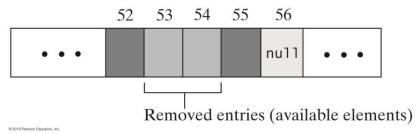
location's entry was removed from the dictionary

Linear Probing





(b) After removing two entries



(c) After a search

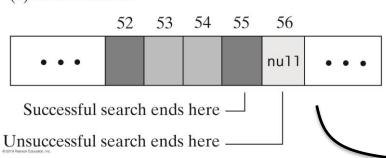
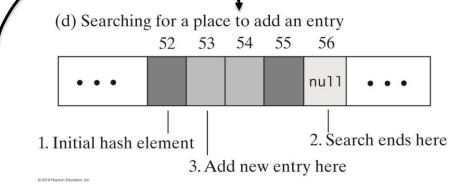
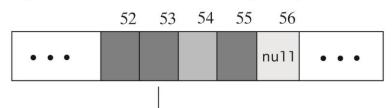


FIGURE 22-6 The linear probe sequence in various situations



(e) After an addition to a formerly occupied element



Most recent addition will be found faster in element 53 than if it were in element 54 or 56

Dark gray = occupied with current entry Medium gray = available element Light gray = empty element (contains null)

Linear Probing - Probe Algorithm

Algorithm probe(index, key)

```
// Searches the probe sequence that begins at index. Returns the index of either the element
// containing key or an available element in the hash table.
while (key is not found and hashTable[index] is not null)
                   if (hashTable[index] references an entry in the dictionary)
                                       if (the entry in hashTable[index] contains key)
                                                           Exit loop
                                       else
                                                           index = next probe index
                   else // hashTable[index] is available
                                       if (this is the first available element encountered)
                                                           availableStateIndex = index
                                       index = next probe index
if (key is found or an available element was not encountered)
                   return index
else
                   return availableStateIndex // Index of first entry removed
```

Linear Probe Algorithm

```
// Precondition: checkIntegrity has been called.
private int linearProbe(int index, K key)
           boolean found = false;
           int availableStateIndex = -1; // Index of first element in available state
           while ( !found && (hashTable[index] != null) )
                      if (hashTable[index] != AVAILABLE)
                                             if (key.equals(hashTable[index].getKey()))
                                                        found = true; // Key found
                                             else
                                                     // Follow probe sequence
                                                         index = (index + 1) % hashTable.length; // Linear probing
                      else // Element in available state; skip it, but mark the first one encountered
                                             // Save index of first element in available state
                                             if (availableStateIndex == −1)
                                      availableStateIndex = index:
                                             index = (index + 1) % hashTable.length;
                                                                                          // Linear probing
                      } // end if
           } // end while
           // Assertion: Either key or null is found at hashTable[index]
           if (found | | (availableStateIndex == -1))
                                  return index;
                                                              // Index of either key or null
           else
                                  return availableStateIndex; // Index of an available element
} // end linearProbe
```

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Revised version of linear probe

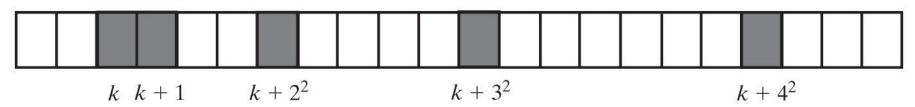
```
private int linearProbe(int index, K key) {
      boolean found = false;
      // Index of first available location (from which an entry was removed)
      int availableIndex = -1;
      // start looking at keys at the index location, then increment until key is found
      while (!found && (hashTable[index] != null)) {
            // if there is an entry in the location test for equality
             if (hasAnEntry(index)) {
                   if(key.equals(hashTable[index].getKey()))
                                found = true; // Key found
            } else
                   // Skip entries that were removed
                   // but save index of first location in removed state
                   if (availableIndex == -1)
                         availableIndex = index;
             // if there was an entry but it wasn't the key, increment th
             // index and try again
             if(!found)
                   index = setHashIndex(index + 1); // Linear probing
      // if the key is found return the location
      // if we didn't find the key and there are only null entries, return the first
      // null entry
      // otherwise, return the first available index
      if (found | (availableIndex == -1))
             return index; // Index of either key or null
      else
             return availableIndex; // Index of an available location
} // end linearProbe
```

Clustering

- Collisions resolved with linear probing cause groups of consecutive locations in hash table to be occupied
 - Each group is called a *cluster*
- Bigger clusters mean longer search times following collision

Open Addressing with Quadratic Probing

- Linear probing looks at consecutive locations beginning at index ${m k}$
- Quadratic probing:
 - \circ Considers the locations at indices $k + j^2$
 - \circ Uses the indices k, k + 1, k + 4, k + 9, ...



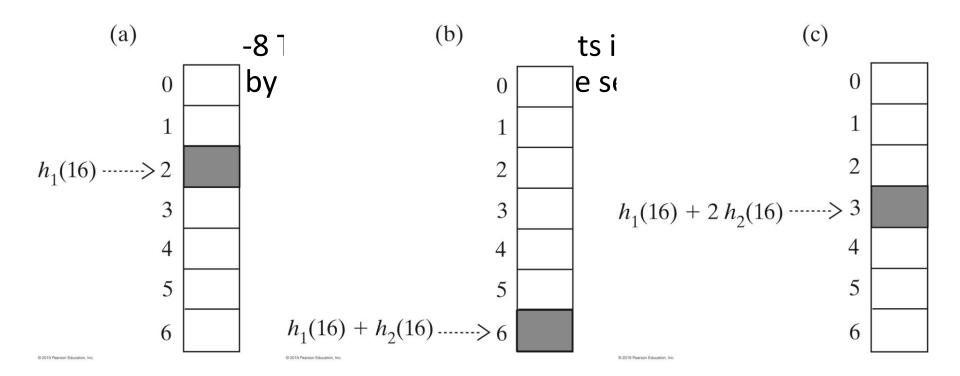
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FIGURE 22-7 A probe sequence of length five using quadratic probing

Open Addressing with Double Hashing

- Linear probing and quadratic probing add increments to k to define a probe sequence
 - Both are independent of the search key
- Double hashing uses a second hash function to compute these increments
 - This is a key-dependent method.

Open Addressing with Double Hashing



Potential Problem with Open Addressing

- Recall each location is either occupied, empty, or available
 - Frequent additions and removals can result in no locations that are null
- Thus searching a probe sequence will not work
- Consider separate chaining as a solution

- Alter the structure of the hash table
 - Each location can represent more than one value.
 - Such a location is called a bucket
- Decide how to represent a bucket
 - olist, sorted list
 - oarray
 - olinked nodes
 - o vector

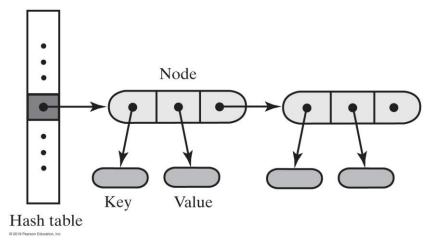
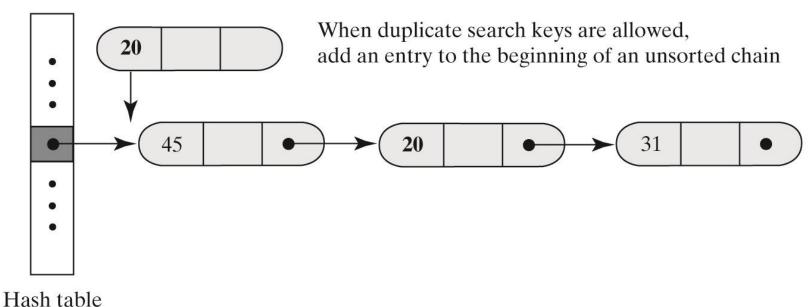


FIGURE 22-9 A hash table for use with separate chaining; each bucket is a chain of linked nodes

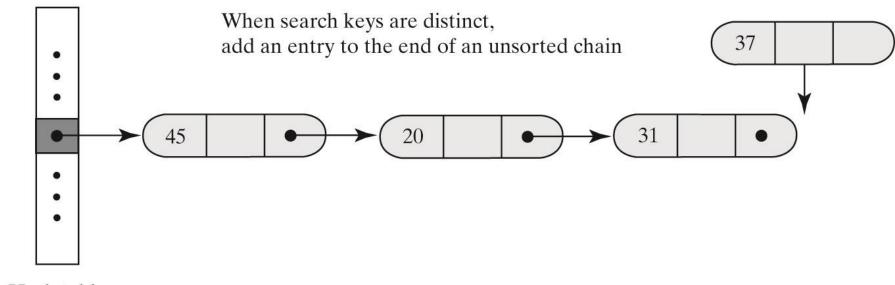
- FIGURE 22-10a Inserting a new entry into a linked bucket according to the nature of the integer search keys
- (a) Unsorted, and possibly duplicate, keys



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 FIGURE 22-10b Inserting a new entry into a linked bucket according to the nature of the integer search keys

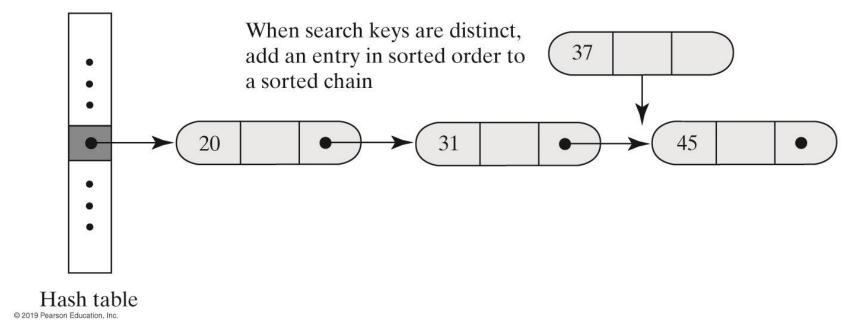
(b) Unsorted and distinct keys



Hash table
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 FIGURE 22-10c Inserting a new entry into a linked bucket according to the nature of the integer search keys

(c) Sorted and distinct keys



Algorithm for the dictionary's add method.

```
Algorithm add(key, value)
index = getHashIndex(key)
if (hashTable[index] == null)
                  hashTable[index] = new Node(key, value)
                  numberOfEntries++
                  return null
else
         Search the chain that begins at hashTable[index] for a node that contains key
         if (key is found)
         { // Assume currentNode references the node that contains
                            key oldValue = currentNode.getValue()
                            currentNode.setValue(value)
                            return oldValue
         else // Add new node to end of chain
         {//Assume nodeBefore references the last node
                            newNode = new Node(key, value)
                            nodeBefore.setNextNode(newNode) numberOfEntries++
                            return null
```

Algorithm for the dictionary's remove method.

```
Algorithm remove(key)
index = getHashIndex(key)
Search the chain that begins at hashTable[index] for a node that contains key
if (key is found)
              Remove the node that contains key from the chain
              numberOfEntries--
              return value in removed node
else
              return null
```

• Algorithm for the dictionary's getValue method.

Algorithm getValue(key)

index = getHashIndex(key)

Search the chain that begins at hashTable[index] for a node that contains key if (key is found)

return value in found node

else

return null

Efficiency of Hashing

- Observations about the time efficiency of these operations
 - Successful retrieval/removal has same efficiency as successful search
 - Unsuccessful retrieval/removal has same efficiency as unsuccessful search
 - Successful addition has same efficiency as unsuccessful search
 - Unsuccessful addition has same efficiency as successful search

Load Factor

Definition of load factor:

$$\lambda = \frac{Number\ of\ entries\ in\ the\ dictionary}{Number\ of\ locations\ in\ the\ hash\ table}$$

- Never negative
- For open addressing, $1 \ge \lambda$
- \circ For separate chaining, λ has no maximum value
- \circ Restricting size of λ improves performance

Cost of Open Addressing

Average number of searches for linear probing

For unsuccessful search:

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

For successful search:

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

Cost of Open Addressing

• FIGURE 23-1 The average number of comparisons required by a search of the hash table for given values of the load factor λ when using linear

probing

λ	Unsuccessful Search	Successful Search
0.1	1.1	1.1
0.3	1.5	1.2
0.5	2.5	1.5
0.7	6.1	2.2
0.9	50.5	5.5

Quadratic Probing and Double Hashing

Average number of comparisons needed

For unsuccessful search:
$$\frac{1}{(1-\lambda)}$$

For successful search:
$$\frac{1}{\lambda} \log \left(\frac{1}{1-\lambda} \right)$$

Quadratic Probing and Double Hashing

• FIGURE 23-2 The average number of comparisons required by a search of the hash table for given values of the load factor λ when using either quadratic probing or double hashing

λ	Unsuccessful Search	Successful Search
0.1	1.1	1.1
0.3	1.5	1.2
0.5	2.0	1.4
0.7	3.3	1.7
0.9	10.0	2.6

Cost of Separate Chaining

 Average number of comparisons during a search when separate chaining is used

For unsuccessful search: λ

For successful search: $1 + \lambda/2$

To maintain reasonable efficiency, you should keep λ < 1.

Cost of Separate Chaining

• FIGURE 23-3 The average number of comparisons required by a search of the hash table for given values of the load factor λ when using separate chaining

λ	Unsuccessful Search	Successful Search
0.1	0.1	1.1
0.3	0.3	1.2
0.5	0.5	1.3
0.7	0.7	1.4
0.9	0.9	1.5
1.1	1.1	1.6
1.3	1.3	1.7
1.5	1.5	1.8
1.7	1.7	1.9
1.9	1.9	2.0
2.0	2.0	2.0

Maintaining the Performance of Hashing

- To maintain efficiency, restrict the size of λ as follows:
 - $\circ \lambda$ < 0.5 for open addressing
 - $\circ \lambda$ < 1.0 for separate chaining
- Should the load factor exceed these bounds
 - Increase the size of the hash table

Rehashing

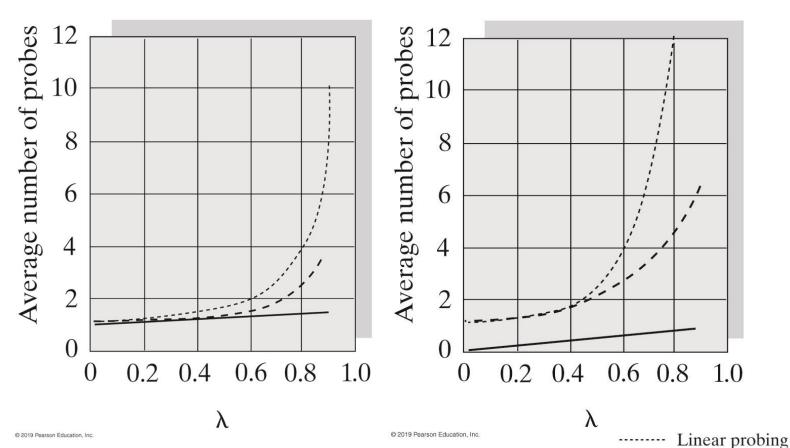
- When the load factor λ becomes too large must resize the hash table
- Compute the table's new size
 - Double its present size
 - Increase the result to the next prime number
 - Use method add to add the current entries in dictionary to new hash table

Comparing Schemes for Collision Resolution

• FIGURE 23-4 The average number of comparisons required by a search of the hash table versus the load factor λ for four collision resolution techniques

(a) Successful search

(b) Unsuccessful search



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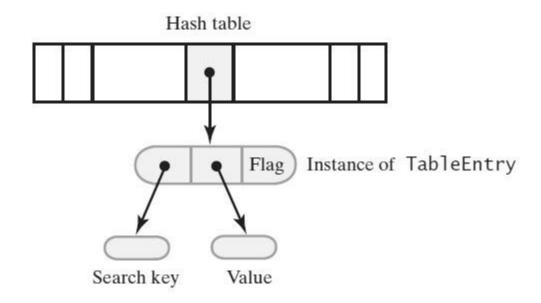
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--- Quadratic probing or double hashing

Separate chaining

Dictionary Implementation That Uses Hashing

• FIGURE 23-5 A hash table and one of its entry objects



HashedDictionary

- Keep an internal table of entries
- Mark an entry as AVAILABLE as an entry with null values.
 - Note this can't be changed
- Define a load factor above which the table will be increased in size

```
public class HashedDictionary<K, V> implements DictionaryInterface<K, V> {
    // The dictionary:
    private int numberOfEntries;

// capacity must be prime, which checkCapacity will automatically set
    // if this is set too low with quadratic probe, search time increases.
    private static final int DEFAULT_CAPACITY = 5;
    private static final int MAX_CAPACITY = 10000;

// The hash table:
    private Entry<K, V>[] hashTable;

private static final int MAX_SIZE = 2 * MAX_CAPACITY; // Max size of hash table
    private static final double MAX_LOAD_FACTOR = 0.5; // Fraction of hash table that can be filled

private final Entry<K, V> AVAILABLE = new Entry<>(null, null);
```

Use a key/value Entry class

Simple generic class to keep keys and values

```
protected final class Entry<K, V> {
           private K key;
           private V value;
           private Entry(K searchKey, V dataValue) {
                      key = searchKey;
                      value = dataValue;
           } // end constructor
           private K getKey() {
                      return key;
           } // end getKey
           private V getValue() {
                      return value;
           } // end getValue
           private void setValue(V newValue) {
                      value = newValue;
           } // end setValue
} // end Entry
```

Constructor

- Make the table size the next prime number up from what was asked.
- Also that the table has enough space re load factor (checkCapacity).

```
public HashedDictionary(int initialCapacity) {
    initialCapacity = checkCapacity(initialCapacity);
    numberOfEntries = 0; // Dictionary is empty

    // Set up hash table:
    // Initial size of hash table is same as initialCapacity if it is prime;
    // otherwise increase it until it is prime size
    int tableSize = getNextPrime(initialCapacity);
    checkSize(tableSize); // Check that the prime size is not too large

    // The cast is safe because the new array contains null entries
    @SuppressWarnings("unchecked")
    Entry<K, V>[] temp = (Entry<K, V>[]) new Entry[tableSize];
    hashTable = temp;
} // end constructor
```

Getting an index in the hash table

- Hash the key, and get an integer.
 - Adjust this so it is modulo the table length, so the hashes are distributed. (setHashIndex()).
 - This will be the starting index
- Then probe starting at the index and look for the key (see next slide)
- Returns a new index of an available entry or key itself.
- Remember, an available entry is either null or the AVAILABLE entry (null key and value).

```
* Get the next available hash index for the key
 * @param key
 * @return
private int getHashIndex(K key) {
               int hashIndex = setHashIndex(key.hashCode());
               // Check for and resolve collision
               hashIndex = linearProbe(hashIndex, key);
               return hashIndex;
} // end getHashIndex
 * Take a <a href="hashcode">hashcode</a> and make sure it fits in the hash table.
 * Wraparound if necessary using mod tablelength.
 * If the resulting index is < 0, add the table length to it.
 * @param index
 * @return index % tablelength
private int setHashIndex(int index) {
               index = index % hashTable.length;
               if(index < 0)
                              index = index + hashTable.length;
               return index;
```

Revised version of linear probe

```
private int linearProbe(int index, K key) {
      boolean found = false;
      // Index of first available location (from which an entry was removed)
      int availableIndex = -1;
      // start looking at keys at the index location, then increment until key is found
      while (!found && (hashTable[index] != null)) {
            // if there is an entry in the location test for equality
             if (hasAnEntry(index)) {
                   if(key.equals(hashTable[index].getKey()))
                                found = true; // Key found
            } else
                   // Skip entries that were removed
                   // but save index of first location in removed state
                   if (availableIndex == -1)
                         availableIndex = index;
             // if there was an entry but it wasn't the key, increment th
             // index and try again
             if(!found)
                   index = setHashIndex(index + 1); // Linear probing
      // if the key is found return the location
      // if we didn't find the key and there are only null entries, return the first
      // null entry
      // otherwise, return the first available index
      if (found | (availableIndex == -1))
             return index; // Index of either key or null
      else
             return availableIndex; // Index of an available location
} // end linearProbe
```

Add method

- Hash the key and get the next available index
- If the slot is free, add the entry to the hash table
- If the key already exists, replace the value

```
public V add(K key, V value) {
                if ((key == null) || (value == null))
                                 throw new IllegalArgumentException("Cannot add null to a dictionary.");
                else {
                                 V oldValue; // Value to return
                                 // get the next available hash index for the key
                                 int index = getHashIndex(key);
                                 if (!hasAnEntry(index)) { // Key not found, so insert new entry
                                                  hashTable[index] = new Entry<>(key, value);
                                                  numberOfEntries++;
                                                  oldValue = null;
                                 } else { // Key found; get old value for return and then replace it
                                                  oldValue = hashTable[index].getValue();
                                                  hashTable[index].setValue(value);
                                 } // end if
                                 // Ensure that hash table is large enough for another add
                                 if (isHashTableTooFull())
                                                  enlargeHashTable();
                                 return oldValue;
                } // end if
} // end add
```

getValue algorithm for retrieval

```
Algorithm getValue(key)

// Returns the value associated with the given search key, if it is in the dictionary.

// Otherwise, returns null.

if (key is found)

return value in found entry

else

return null
```

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getValue implementation

- Get the index by hashing the key
- If it exists, then just get the value using Entry getValue()
 method.

```
public V getValue(K key) {
    V result = null;
    int index = getHashIndex(key);
    if (hasAnEntry(index))
         result = hashTable[index].getValue(); // Key found; get value
    return result;
```

Pseudocode for method remove

```
Algorithm remove(key)
// Removes a specific entry from the dictionary, given its search key.
// Returns either the value that was associated with the search key or null if no such object
// exists.
removedValue = null
index = getHashIndex(key)
if (key is found) // hashTable[index] is not null and does not equal AVAILABLE
              removedValue = hashTable[index].getValue()
               hashTable[index] = AVAILABLE
              numberOfEntries--
return removed Value
```

remove method

- Hash the key and get the index.
- If it exists, get the value, then set the slot to AVAILABLE
 - key and value are null

Algorithm for adding a new entry

Algorithm add(key, value)

```
// Adds a new key-value entry to the dictionary. If key is already in the dictionary,
// returns its corresponding value and replaces it in the dictionary with value.
if ((key == null) or (value == null))
                 Throw an exception
index = getHashIndex(key)
if (key is not found)
{ // Add entry to hash table
                 hashTable[index] = new Entry(key, value)
                 numberOfEntries++
                 oldValue = null
else // Search key is in table; replace and return entry's value
                 oldValue = hashTable[index].getValue()
                 hashTable[index].setValue(value)
// Ensure that hash table is large enough for another addition
if (hash table is too full)
                 Enlarge hash table
return oldValue
```

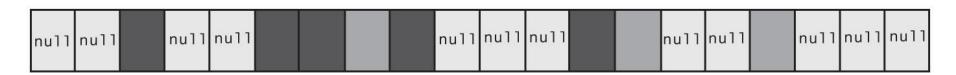
Increase hash table size

- Create a new table with a set of null entries
- Save the old one.
- Important: copy by iterating through the old table and add() the key/value pairs to the new one.
 - This rehashes all of the keys, so it is not an exact duplicate.

```
private void enlargeHashTable() {
      Entry<K, V>[] oldTable = hashTable;
      int oldSize = hashTable.length;
      int newSize = getNextPrime(oldSize + oldSize);
      checkSize(newSize); // Check that the prime size is not too large
      // The cast is safe because the new array contains null entries
      // increase the size of the array
      @SuppressWarnings("unchecked")
      Entry<K, V>[] tempTable = (Entry<K, V>[]) new Entry[newSize];
      // the internal table is now a larger array, but empty
      hashTable = tempTable;
      numberOfEntries = 0; // Reset number of dictionary entries, since
                                           // it will be incremented by add during rehash
      // Rehash dictionary entries from old array to the new and bigger array;
      // skip both null locations and removed entries
      // note use of add() to do this which rehashes keys
      for (int index = 0; index < oldSize; index++) {</pre>
            if ((oldTable[index] != null) && (oldTable[index] != AVAILABLE))
                  add(oldTable[index].getKey(), oldTable[index].getValue());
```

Hash Tables and Iterators

• FIGURE 23-5 A hash table containing occupied elements, available elements, and null values



Dark gray = occupied with current entry Medium gray = available location Light gray = empty location (null)

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Key iterator

```
private class KeyIterator implements Iterator<K> {
     private int currentIndex; // Current position in hash table
     private int numberLeft; // Number of entries left in iteration
     private KeyIterator() {
          currentIndex = 0;
          numberLeft = numberOfEntries:
     } // end default constructor
     public boolean hasNext() {
          return numberLeft > 0;
     } // end hasNext
     public K next() {
          K result = null;
          if (hasNext()) {
                // Skip table locations that do not contain a current entry
                while (!hasAnEntry(currentIndex)) {
                     currentIndex++;
                } // end while
                result = hashTable[currentIndex].getKey();
                numberLeft--;
                currentIndex++;
          } else
                throw new NoSuchElementException();
          return result;
     } // end next
     public void remove() {
          throw new UnsupportedOperationException();
     } // end remove
} // end KeyIterator
```

Value iterator

```
private class ValueIterator implements Iterator<V> {
     private int currentIndex;
     private int numberLeft;
     private ValueIterator() {
           currentIndex = 0;
           numberLeft = numberOfEntries;
     } // end default constructor
     public boolean hasNext() {
           return numberLeft > 0;
     } // end hasNext
     public V next() {
           V result = null;
           if (hasNext()) {
                 // Skip table locations that do not contain a current entry
                 while (!hasAnEntry(currentIndex)) {
                       currentIndex++;
                 } // end while
                 result = hashTable[currentIndex].getValue();
                 numberLeft--:
                 currentIndex++;
           } else
                 throw new NoSuchElementException();
           return result;
     } // end next
     public void remove() {
           throw new UnsupportedOperationException();
     } // end remove
} // end ValueIterator
```

Java Class Library: The Class HashMap

- Hash table is a collection of buckets
 - Each bucket contains several entries
- Variety of constructors provided
- Default maximum load factor of 0.75
 - When limit exceeded, size of table increased by rehashing
- Possible to avoid rehashing by setting number of buckets initially larger

Java Class Library: The Class HashSet

- Implements the interface java.util.Set
- HashSet uses an instance of the class HashMap
- Variety of constructors provided in class