

Software Development (cs2500)

Lectures 48 & 49: The Collections Framework

M. R. C. van Dongen

February 7, 2014

Outline

Collections

Linked Lists

Sets

Maps

Queues

Hashing

For Wednesday

Acknowledgements

About this Document

- Study the Java Collection Framework.
- Finalise our in-depth study of linked lists.
- Explore the *Set* interface.
- Use the *Map* interface to implement lookup tables.

Java Collections Framework

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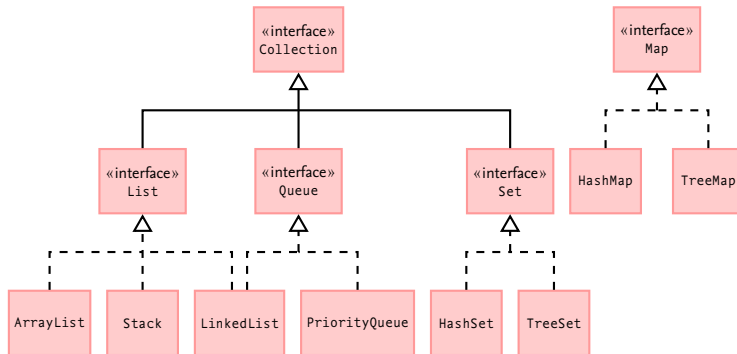
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About this Document

- Framework for storing items, querying, and traversing.
- All interfaces and classes are generic.
- At the top are the Collection and Map interfaces.
 - A `Collection<T>` is for storing/retrieving `T`s.
 - A `Map<K, V>` is for looking up value `V` using key `K`.
 - In some sense, a `Collection<T>` is a `Map<T, T>`.

Collections Hierarchy

All Interfaces/Classes are Generic



Collection<T> API

- `size()` Determine the size of the collection.
- `add(T item)` Add a member to the collection.
- `toString()` Compute String of what's in the collection.
- `remove(T item)` Tentatively remove `item` from collection.
 - Returns true if and only if successful.
- `contains(T item)` Determine whether `item` is in the collection.
 - Returns true if and only if `item` is in it.
- `iterator()` Returns an `Iterator<T>`.
 - Defined in `Iterable<T>` interface.
 - Used to traverse the collection.
 - If a class implements `Iterable<T>`, you can use enhanced for notation.

Implementing remove()

Java

```
public class MyList<T> {  
    private Link<T> nodes;  
  
    ...  
  
    private static class Link<T> {  
        private T head;  
        private Link<T> tail;  
  
        ...  
    }  
}
```

Implementing remove() (Continued)

Worst-Case Performance Proportional to Length of List

Java

```
public boolean remove( T item ) {
    final boolean result;

    if (nodes == null) {
        result = false;
    } else if (nodes.head.equals( item )) {
        result = true;
        nodes = nodes.tail;
    } else {
        Link<T> link = nodes;
        while ((link.tail != null) && (!link.tail.head.equals( item ))) {
            link = link.tail;
        }
        result = link.tail != null;
        if (result) {
            link.tail = link.tail.tail;
        }
    }

    return result;
}
```

Iterator<T> and Iterable<T>

Iterator Used to traverse collection.

Implementing classes must override:

`hasNext()` Determine whether there's another member.

`next()` Get the next member.

`remove()` Remove most recent `next()` value.

■ Implementing this method is optional.

Iterable Implementing classes must override `iterator()`:

■ `public Iterator<T> iterator()`

■ Traverse Iterable classes with enhanced for:

```
■ for (T item : collection) {  
    /* use item */  
}
```


Implementing Iterable

Java

```
@Override
public Iterator<T> iterator( ) {
    return new Iterator<T>( ) {
        private Link<T> current = nodes;

        @Override
        public boolean hasNext( ) {
            return current != null;
        }

        @Override
        public T next( ) {
            final T next = current.head;
            current = current.tail;
            return next;
        }

        @Override
        public void remove( ) {
        }
    };
}
```

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Singly Linked Lists

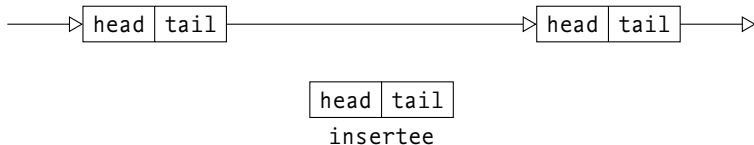
- So far we've implemented singly linked lists.
- At the top level a Link instance, nodes, represents the members.
- Inserting a new Link depends on two cases:

`nodes == null` No need to locate insertion position:

- 1 Create the new Link.
- 2 Assign Link to nodes.

`nodes != null` We must locate insertion position:

- 1 Create the new Link, insertee.
- 2 Find Link, position, to insert the Link.
- 3 Assign position.tail to insertee.tail.
- 4 Assign insertee to position.tail.



Singly Linked Lists

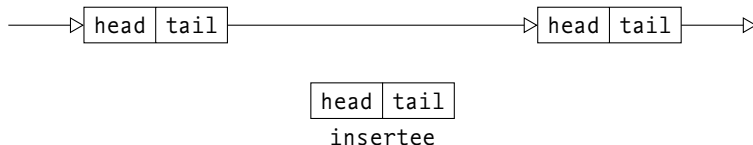
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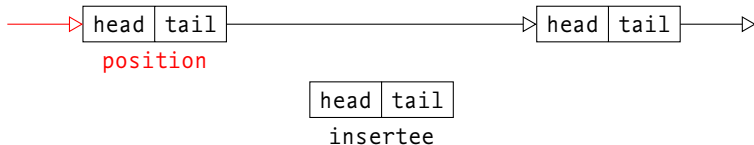
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- Inserting a new `Link` depends on two cases:

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- Assign `Link` to `nodes`.

`nodes != null` We must locate insertion position:

- Create the new `Link`, `insertee`.
- Find `Link`, `position`, to insert the `Link`.
- Assign `position.tail` to `insertee.tail`.
- Assign `insertee` to `position.tail`.



Singly Linked Lists

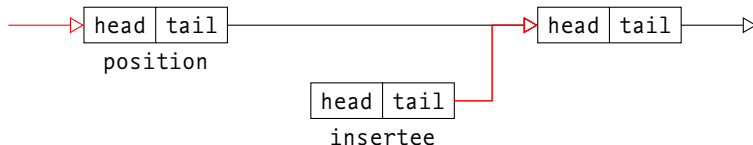
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Singly Linked Lists

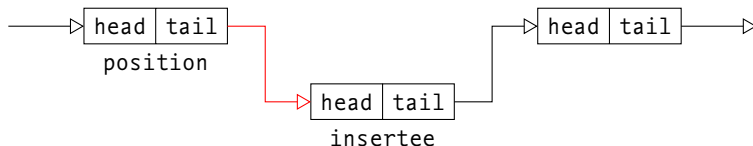
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Singly Linked Lists

Analysis

- ❑ Modern CPUs try to predict next instruction.
 - ❑ With branching, this prediction becomes difficult.
 - ❑ Inserting an item needs branching, so it's not ideal.
- ❑ Inserting at start of list is constant time operation.
 - ❑ Inserting at end requires linear time (in length of list).

Enters the Doubly Linked List

- A *doubly linked list* overcomes the singly linked list's problems.
- It requires no branching when inserting a new `Link`.
 - (Provided the insertion position is known.)
- Also supports constant time operation for appending items.
- Allows removal of `Link` in constant time.
 - (Provided a reference to `Link` is known.)
- Can be implemented with `addAfter()` and `addBefore()`.

The Data Structure

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```
public class DList<T> {
    private DLink<T> sentinel;

    public DList( ) {
        sentinel = new DLink( );
    }

    ...

    private static class DLink<T> {
        private T data;
        private DLink<T> prev;
        private DLink<T> next;

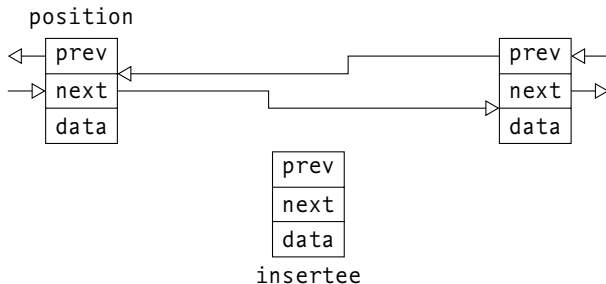
        private DLink( ) {
            prev = next = this;
        }
    }
}
```

The addAfter() Operation

AddBefore() is Similar

Java

```
private static void addAfter( final DLink<T> position, final DLink<T> insertee ) {  
    insertee.next = position.next;  
    insertee.prev = position;  
    position.next.prev = insertee;  
    position.next = insertee;  
}
```

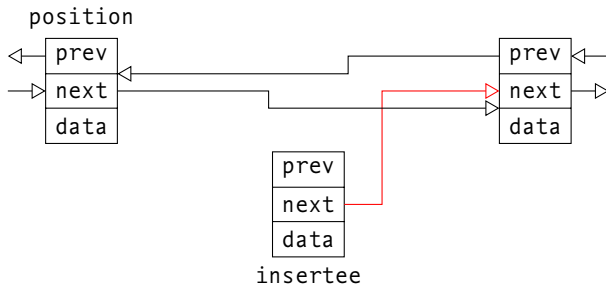
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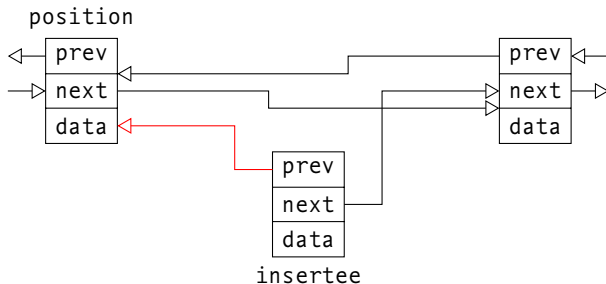
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    position.next.prev = insertee;  
    position.next = insertee;  
}
```

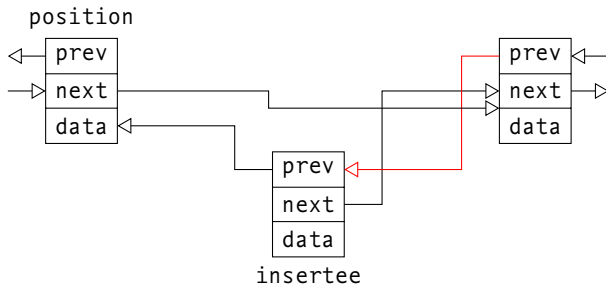
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}
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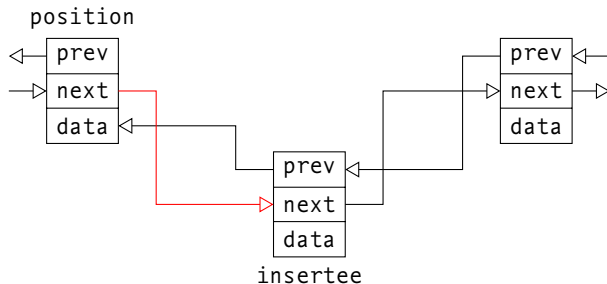
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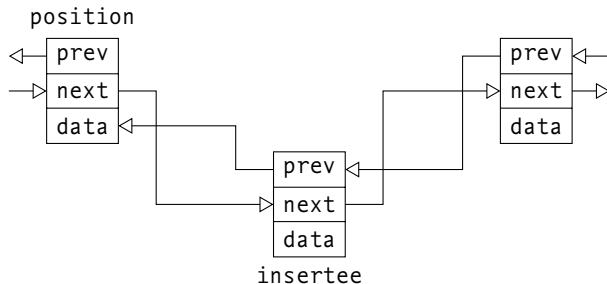
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}
```

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- The Set interface is for collections without repetitions.
- The order of traversal depends on the implementing class.

HashSet No “real” order.

- Uses `item.hashCode()` for `add(item)` and `remove(item)`.
- Good average performance for `add()` and `remove()` if there are few `hashCode()` collisions.

TreeSet Set with order.

- Uses tree to represent the set.
- Order determined by `compareTo()`.
- Usually poorer performance for `add()` & `remove()`.

Introduction to HashSets

- HashSet usually provides good average performance.
- Uses `hashCode()` to partition members in to subcollections.
- Members with “similar” `hashCode()` go to same subcollection.
 - Equality in subcollections is decided with `equals()`.
 - Classes usually override `equals()`.
- Good performance guaranteed if subcollections don’t “overflow.”
- Diversifying the `hashCode()` values makes “overflow” less likely.

- ❑ Deciding deep equality is an expensive operation.
- ❑ The `HashSet` class uses `equals()` to decide equality.
- ❑ If you override `equals()` you must override `hashCode()`.
- ❑ All Java classes make assumptions about `hashCode()`:
 - ❑ The same object must always return the same `hashCode()`.
 - ❑ Two deeply equal objects must have the same `hashCode()`.
 - ❑ (Different objects may have the same `hashCode()`.)
- ❑ With these assumptions, we can decide deep equality as follows:
 - ❑ If `a.hashCode() != b.hashCode()` then `!a.equals(b)`;
 - ❑ Else use `a.equals(b)`.
- ❑ This is usually very efficient, provided
 - ❑ `hashCode()` is fast; and
 - ❑ `hashCode()` depends on as many relevant attributes as possible.

Computing Hash Codes

- By default different objects have different `hashCode()` values.
- This is usually not useful, so we must override it.
- Take as much information into account as possible.
- “Information” are the attributes that determine `equals()`.
- This generally reduces collisions.

Computing Hash Codes (Continued)

Overall Method

- 1 Initialise result with some nonzero value;
- 2 For each relevant attribute:
 - 1 Compute an int, intCode, for the attribute;
 - 2 Combine the the current value of result and intCode:
 $\text{result} = \text{result} * 31 + \text{intCode}.$
- 3 Return result.

Computing Hash Codes (Continued)

Computing `intCode` of `Attribute`, `attr`

- If attribute is boolean return `attr ? 1 : 0`;
- If it's byte, char, or short, return `(int)attr`;
- If it's an int return `attr`;
- If it's a long return `attr ^ (attr >>> 32)`;
- If it's a float, return `Float.floatToIntBits(attr)`;
- If it's a double, return `Double.doubleToIntBits(attr)`;
- If it's null return 0;
- If it's an array:
 - If all values are relevant, return `Arrays.hashCode(attr)`.
 - Recursively compute a hash code for the relevant values.
- Otherwise, return `attr.hashCode()`.

Example

Java

```
public class Person {
    final static int INITIAL_HASH_CODE = 17;
    final static int HASH_MULTIPLIER = 31;
    private final String name;
    private final boolean isMale;
    private final int age;

    ...

    @Override
    public boolean equals( Object that ) {
        final Person p = (Person)that;
        return (name.equals( p.name )) && (age == p.age);
    }

    @Override
    public int hashCode( ) {
        int result = INITIAL_HASH_CODE;
        result = result * HASH_MULTIPLIER + age;
        result = result * HASH_MULTIPLIER + (isMale ? 1 : 0);
        result = result * HASH_MULTIPLIER + name.hashCode( );
        return result;
    }
}
```

Using the Person Class

Java

```
// Always use an interface variable to reference the set.  
final Set<Person> set = new HashSet<Person>( );  
set.add( new Person( "Joe", true, 20 ) );  
set.add( new Person( "Jane", false, 20 ) );  
...
```

When Computations get Expensive

Don't Try This at Home

```
public class Casher {  
    ...  
  
    public Casher( ... ) {  
        // initialise attribute values.  
    }  
  
    @Override  
    public int hashCode( ) {  
        return motherOfAllHashCodeComputations( );  
    }  
}
```


To Avoid Recomputing, you can Cache the Value

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Java

```
public class Casher {
    private static final hashCode;
    ...

    public Casher( ... ) {
        // first initialise attribute values.
        ...
        hashCode = motherOfAllHashCodeComputations( );
    }

    @Override
    public int hashCode( ) {
        return hashCode( );
    }
}
```

Lazy Computation

Code is Correct for Single-Threaded Classes

- Initialising many hash code values may take too long.
- When too many hash codes are initialised at the same time, this may cause unacceptable delays.
- You can postpone the expensive initialisation.
 - Makes sense if you don't need the hash code values.
- This is called *lazy initialisation*.
 - Intelligent classes such as String use lazy initialisation.

Java

```
public class Lazy {  
    private Integer hashCode;  
  
    ...  
  
    @Override  
    public int hashCode( ) {  
        if (hashCode == null) {  
            hashCode = motherOfAllInitialHashCodeComputations( );  
        }  
        return hashCode;  
    }  
}
```

Maps

- A Map is like a mathematical function.
- It maps a *key* to a *value*.
- The Map interface is generic: `Map<K, V>`.
- A given key can only have no more than one value.
- Some keys have no values: their values are `null`.
- There are several Map implementations:
 - `HashMap`.
 - `TreeMap`.

Instance Methods

`put(key, value)` Add value for key.

- ▣ Returns current value if present;
- ▣ Otherwise null.

`get(key)` Get value of key; null if not present.

`keySet()` Get a set representation of the keys.

Example

Java

```
final Map<Color,String> map = HashMap<Color,String>( );
map.put( Color.RED, "Bad" );
map.put( Color.Green, "Good" );
map.put( Color.Blue, "Cold" );
```

Introduction

- The Queue class implements a first-in-first-out (FIFO) collection.
- The PriorityQueue class implements a *priority queue*.
 - The elements in the collection are ordered.
 - Order depends on `compareTo()`.
 - Least significant instances have higher *priority*.
 - The `remove()` method removes instance with highest priority.

Example

Java

```
public class MyProcess implements Comparable<MyProcess> {
    private int priority;
    private final Task task;

    public static void main( String[] args ) {
        final PriorityQueue<MyProcess> tasks = new PriorityQueue( );
        tasks.add( ... );
        ...
        while (!tasks.isEmpty( )) {
            final Task task = queue.remove( );
            task.run( );
        }
    }

    ...
    @Override
    public int compareTo( MyProcess that ) {
        return (this.priority < that.priority) ? -1 :
            (this.priority > that.priority) ? 1 : 0;
    }
}
```

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- Hashing maps keys to positions in arrays.
- *Perfect hashing* maps different keys to different positions.
- Perfect hashing is rarely possible:
 - In general *collisions* will occur.
 - Should they occur, these collisions should be *resolved*.
- We shall study two classes of collision resolution strategies.
 - Open addressing: here we look for other free cells.
 - Separate chaining: stores colliding keys in a special data structure.

Implementing a Table Class

- Arrays are the basic data structure for many applications.
- However, storing and retrieving by index isn't always ideal.
- E.g., let's assume we want to implement a Table (Map) class.
- Each item in the Table has a *key*.
- Different items have different keys.
- The Table supports the following methods.

`Table(int size)`: Create an *empty* Table object.

`isFull()`: Determine if the Table is full.

`add(Object o)`: Add a new item to the Table.

`remove(Object o)`: Remove existing item from the Table.

`contains(Object o)`: Decide if the Table contains o.

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`add(Object o)`: Add a new item to the Table.

`remove(Object o)`: Remove existing item from the Table.

`contains(Object o)`: Decide if the Table contains o.

- All operations should be fast.
- We shall use an array to store each object in the Table.
- We use the keys to determine the object's positions.
- How do we map the keys to index positions in the array?

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First Attempt: Use hashCode()

Don't Try This at Home

```
public class Table {
    private final Object[] members;

    public Table( int size ) {
        members = new Object[ size ];
    }

    private int hashFunction( Object o ) {
        return Math.abs( o.hashCode( ) ) % members.length;
    }

    public void add( Object o ) {
        members[ hashFunction( o ) ] = o;
    }

    public void remove( Object o ) {
        members[ hashFunction( o ) ] = null;
    }

    public boolean contains( Object o ) {
        return (o != null)
            && (o == members[ hashFunction( o ) ]);
    }
}
```

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Let's See

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`hashCode()`

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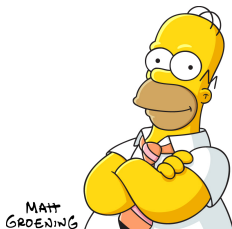
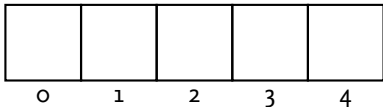
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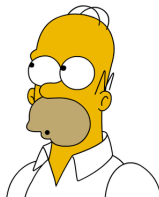
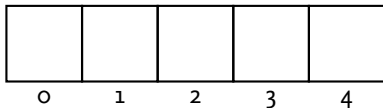
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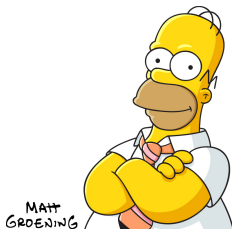
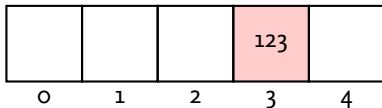
Let's See

Add Object with HashCode 123



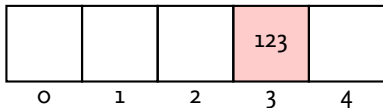
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Add Object with HashCode 123

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Let's See

Add Object with HashCode 20



Let's See

Add Object with HashCode 20

20			123	
0	1	2	3	4



Let's See

Add Object with HashCode 666

20			123	
0	1	2	3	4



Let's See

Add Object with HashCode 666

20	666		123	
0	1	2	3	4



Let's See

Add Object with hashCode 33

20	666		123	
0	1	2	3	4

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Let's See

Add Object with HashCode 33

20	666		123 33	
0	1	2	3	4

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Let's See

Add Object with HashCode 33

20	666		123 33	
0	1	2	3	4



Let's See

You Caaan't Do That



20	666		123 33	
0	1	2	3	4



Hash Functions

Definition (Hash Function)

- A *hash function* is a function that maps its argument to an index position of an array.

Java

```
public class IntTable {  
    final int[] members;  
  
    private int hashFunction( int key ) {  
        return Math.abs( key ) % members.length;  
    }  
    ...  
}
```

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Ideal Hash Function Properties

- Good hash functions should be correct:
 - The result should be an allowed index.
- They should be fast.
- They should minimise collisions.
- Random keys should result in random index positions.

More Complications

- Let's assume we have three objects.
- The hash codes of the objects are 0, 1, and 5.
- Let's also assume we have two Table objects.
- Table 1 has a capacity of 3: its hash function is $h_3(c) = c \% 3$.
- Table 2 has a capacity of 4: its hash function is $h_4(c) = c \% 4$.
- With the first hash function we get no collisions:
 - $h_3(0) = 0$, $h_3(1) = 1$, and $h_3(5) = 2$.
- With the second hash function we get a collision:
 - $h_4(0) = 0$, $h_4(1) = 1$, and $h_4(5) = 1$.
- So, how do we fix this problem?

Different Hash Functions

- Possible solution:
 - Let each Table object *compute* its own hash function.
- They start with a random hash function.
- They use it until a collision arises.
- When the collision arises:
 - The Table computes a new random hash function.
 - The new hash function should resolve the collision.

A Family of 2-Universal Hash Functions

- Assume the hash codes are in the domain $U = \{0, \dots, m-1\}$.
- Furthermore, assume our array has length $n \leq m$.
- Let $p \geq m$ be a random prime.
- Finally, let $0 < a < p$ and $0 \leq b \leq p$ be random integers.
- Consider the following hash function:

$$h_{a,b}(x) = ((ax + b) \% p) \% n.$$

- You can prove that if x and y are random members from U , then

$$\mathbb{P}(h_{a,b}(x) = h_{a,b}(y)) \leq 1/n. \quad (1)$$

- Mitzenmacher, and Upfal [2005, Lemma 13.6] prove (1).

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Improving our Hash Functions

Java

```
public class IntTable {
    final Random rand;
    int[] array;
    int a, b, m, p;

    public IntTable( int size, int m ) {
        array = new int[ size ];
        rand = new Random( );
        this.m = m;
        computeNewHashFunctionConstants( );
    }

    private void computeNewHashFunctionConstants( ) {
        p = randomPrime( m );
        a = 1 + rand.nextInt( p - 2 );
        b = rand.nextInt( p + 1 );
    }

    // ASSUMPTION 0 <= x < m.
    private int hashFunction( int x ) {
        final int n = array.length;
        return ((a * x + b) % p) % n;
    }
    ...
}
```

Collision Resolution

- A *perfect hash function* maps each key to a unique index.
- Non-perfect hash function may result in collisions.
 - They cannot be avoided.
- If a collision occurs when adding a key,
 - We must *resolve the collision*.
- There are two techniques:
 - Open addressing: Use a different, free index.
 - Buckets: Allow multiple keys per index.

Running Example (Start)

Letters Left: B_2, J_{10}, S_{19}



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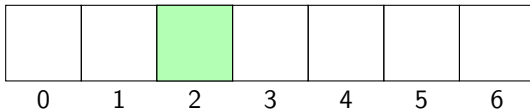
Running Example (Start)

Letters Left: B_2, J_{10}, S_{19}



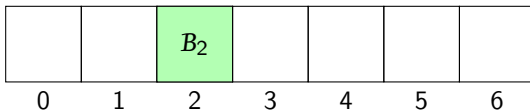
Running Example (Start)

Letters Left: B_2, J_{10}, S_{19}



Running Example (Start)

Letters Left: B_2, J_{10}, S_{19}



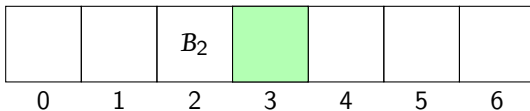
Running Example (Start)

Letters Left: J_{10} , S_{19}



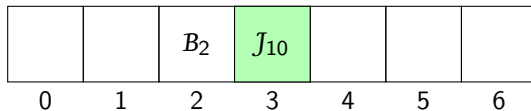
Running Example (Start)

Letters Left: J_{10} , S_{19}



Running Example (Start)

Letters Left: J_{10} , S_{19}



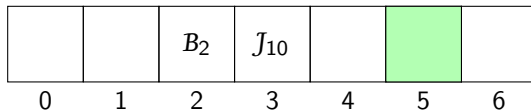
Running Example (Start)

Letters Left: S_{19}

		B_2	J_{10}			
0	1	2	3	4	5	6

Running Example (Start)

Letters Left: S_{19}



Running Example (Start)

Letters Left: S_{19}

		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Running Example (Start)

Letters Left:

		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Open Addressing with Linear Probing

- Let $n > 2$ be a prime and let's assume we have an n -sized array that isn't full.
- Furthermore, let's assume we want to insert a key, k .
- However, this time a collision occurs.
- To resolve the collision we need to find a free cell.
- We start at $h(k)$, next visit $(h(k) - 1) \% n$, visit $(h(k) - 2) \% n$,
- Eventually, we should find some free cell.
- This collision resolution policy is called *linear probing*.

Example

Letters Left: N_{14} , X_{24} , W_{23}

		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: N_{14} , X_{24} , W_{23}

		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: N_{14} , X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: N_{14} , X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: X_{24} , W_{23}

N_{14}		B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: X_{24} , W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	
0	1	2	3	4	5	6

Example

Letters Left: W_{23}

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Example

Letters Left:

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Probe Sequences

- Linear probing visits a sequence of occupied and free indices.
- The sequence of occupied cells is called the *probe sequence*.
- The key, k , and the hash function determine the sequence's first index: $h(k)$.
- The remaining indices are determined by the collision resolution policy.
- The i th next index is $(h(k) - i \times p(k)) \% n$,
 - Where $p(\cdot)$ is the *probe decrement function*.
- For linear probing the probe decrement function is given by $p(k) = 1$.

Removing an Item:

- When removing a value we shouldn't break a probe sequence.
- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Remove B_2

- When removing a value we shouldn't break a probe sequence.
- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

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Removing an Item: Remove B_2

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- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}		J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Locate X_{24}

- When removing a value we shouldn't break a probe sequence.
- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}		J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

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Removing an Item: Locate X_{24}

- When removing a value we shouldn't break a probe sequence.
- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}		J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

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Removing an Item: Locate X_{24}

- When removing a value we shouldn't break a probe sequence.
- E.g. let's assume we remove B_2 by making Cell 2 empty.
- If make it empty we'll have problems locating X_{24} :
 - A free cell in the sequence should indicate that B_2 isn't in the table.

N_{14}	X_{24}		J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

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Removing an Item:

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Remove B_2

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	B_2	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Remove B_2

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	\perp	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Locate X_{24}

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	\perp	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Locate X_{24}

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	\perp	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Locate X_{24}

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	\perp	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Removing an Item: Locate X_{24}

- Instead of making B_2 's cell available, we mark it \perp .
 - When looking for items we treat \perp as a used cell.
 - When looking for free cells we treat \perp as a free cell.

N_{14}	X_{24}	\perp	J_{10}		S_{19}	W_{23}
0	1	2	3	4	5	6

Linear Probing Revisited

- ❑ Linear probing is not a good collision resolution policy.
- ❑ It tends to lead to clusters, which in their turn lead to bigger clusters,
- ❑ With large clusters you get long probe sequences.
- ❑ The larger the clusters get the faster they grow.
- ❑ In general it is better to have *different* probe decrements for different keys.
- ❑ This is called *double hashing*.

Double Hashing

- With double hashing we have two hash functions.
 - $h_1(k)$ should be random index.
 - $h_2(k)$ should be a random probe decrement as a function of k .
- We use the two to compute the probe sequence (**modulo n**):

$$h_1(k), h_1(k) - h_2(k), h_1(k) - 2h_2(k), h_1(k) - 3h_2(k), \dots$$

- Square hopping should still work with $h_2(\cdot)$.
 - Therefore $h_2(k)$ should be *relative prime* to n .
- Usually, n is a power of two.
- If n is a power of two and $h_2(k)$ is odd,
 - Then $h_2(k)$ and n are relative prime [Cormen et al. **2001**].

Limitations of Open Addressing

- Frequent additions cause clustering.
- Frequent additions will eventually fill the table.
- Both problems may be overcome by resizing the table.
- Java has many classes based on hashing.
- Many re-size themselves so as to ensure good performance.

Separate Chaining

- Another collision resolution strategy is *separate chaining*.
- It changes the structure of the hash table.
- Table locations now store *multiple* values.
- Each non-empty table index now has a *bucket*.
- Initially all buckets are empty.
- When a key is mapped to a location,
 - We add it to the location's bucket.
- A possible implementation for the bucket is a linked list.
- Separate chaining provides a simple way to resolve collisions.
- However, it requires more memory than open addressing.

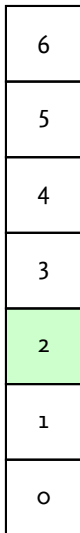
Example

Letters Left: $B_2, J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$

6
5
4
3
2
1
0

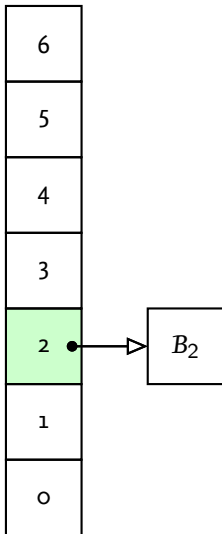
Example

Letters Left: $B_2, J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$



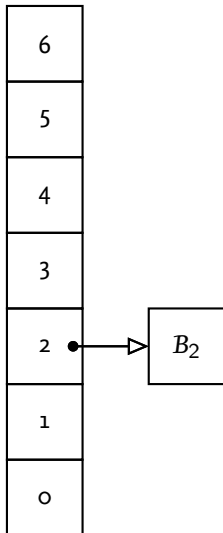
Example

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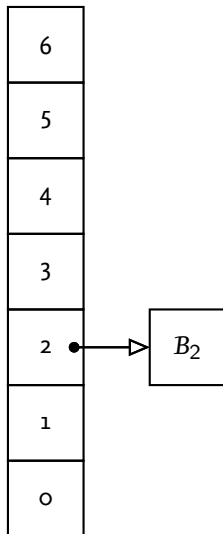
Example

Letters Left: $B_2, J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$

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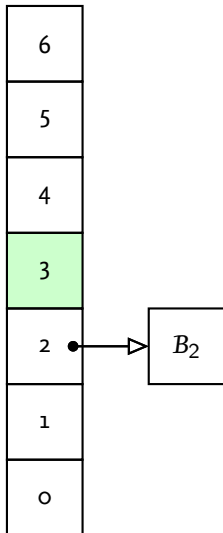
Example

Letters Left: $J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$

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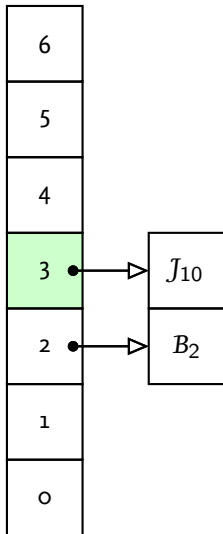
Example

Letters Left: $J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$



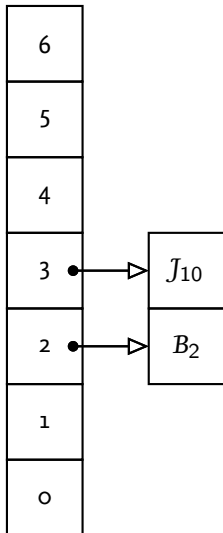
Example

Letters Left: $J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$



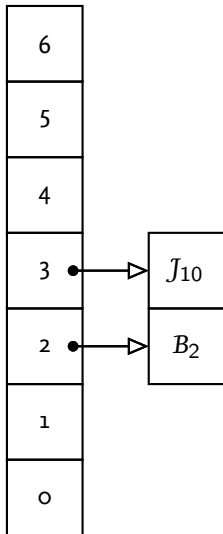
Example

Letters Left: $J_{10}, S_{19}, N_{14}, X_{24}, W_{23}$

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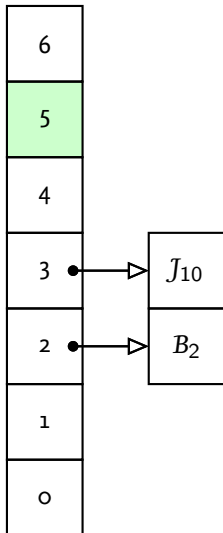
Example

Letters Left: $S_{19}, N_{14}, X_{24}, W_{23}$

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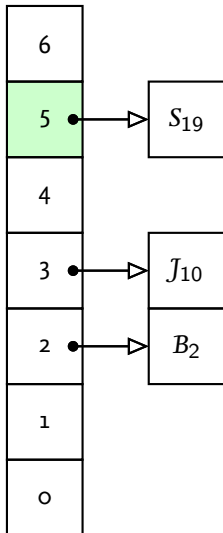
Example

Letters Left: $S_{19}, N_{14}, X_{24}, W_{23}$

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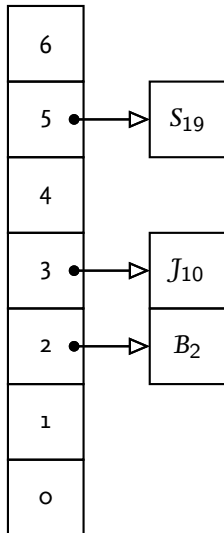
Example

Letters Left: $S_{19}, N_{14}, X_{24}, W_{23}$



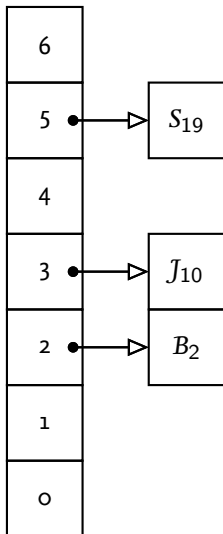
Example

Letters Left: $S_{19}, N_{14}, X_{24}, W_{23}$

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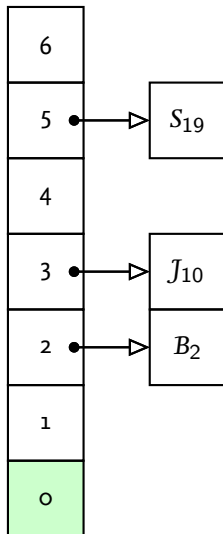
Example

Letters Left: N_{14}, X_{24}, W_{23}

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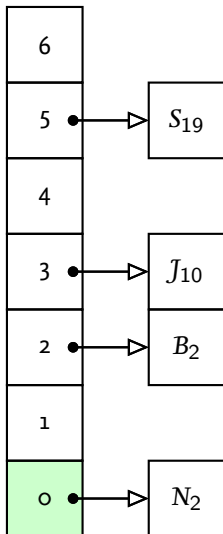
Example

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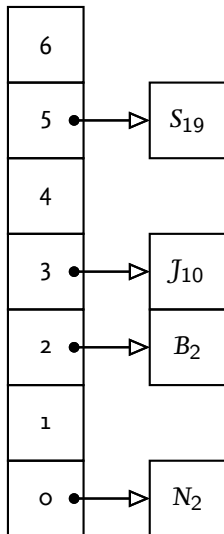
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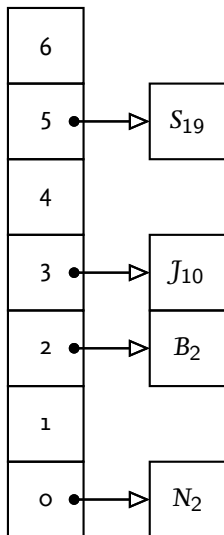
Example

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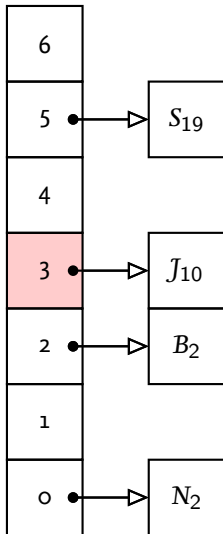
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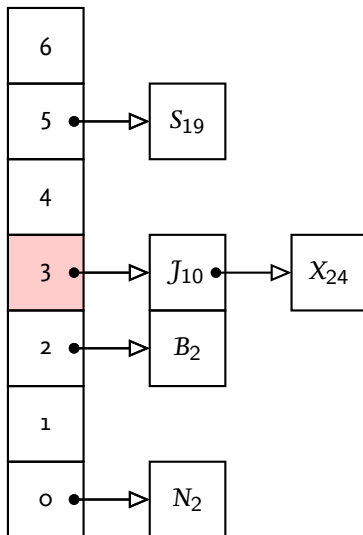
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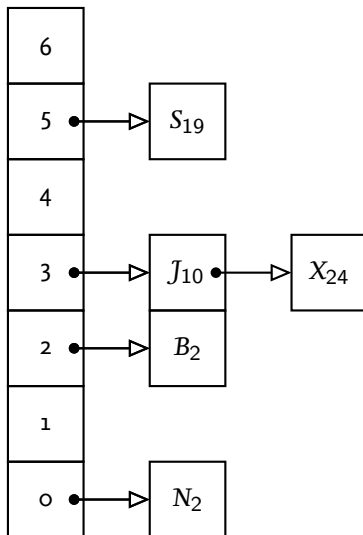
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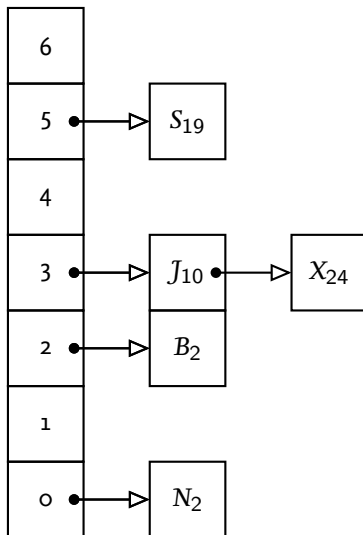
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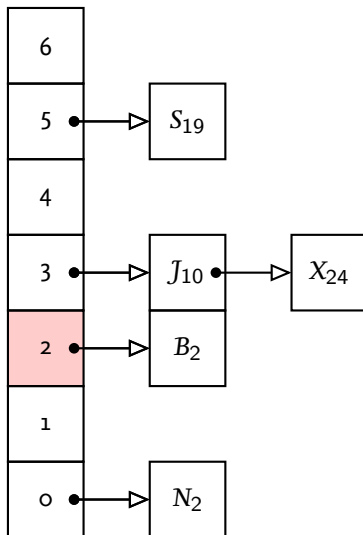
Example

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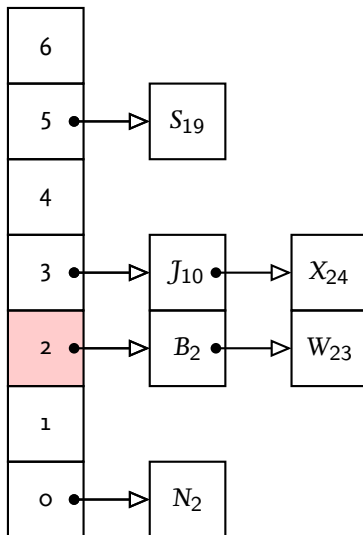
Example

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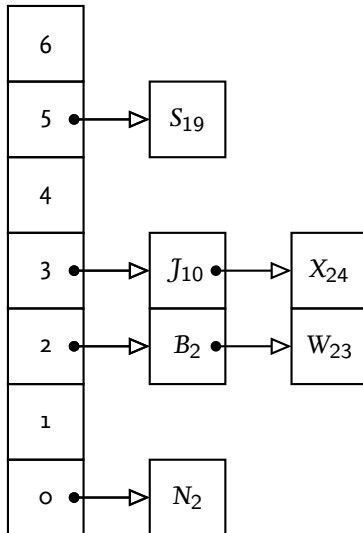
Example

Letters Left: W_{23}



Example

Letters Left: W_{23}



For Wednesday

- Study [Horstmann 2013, Chapter 14.1–14.4].
- Read [Horstmann 2013, Chapter 15.4].

Acknowledgements

- Parts of this lecture correspond to [Horstmann 2013, Chapter 14.1–14.4].
- Overriding `hashCode()` is based on [Bloch 2008, Item 9].
- The part about random hashing is based on [Mitzenmacher, and Upfal 2005].
- The running linear probing example is based on [Standish 1994, Chapter 11].

About this Document

Software Development

M. R. C. van Dongen

Outline

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About this Document

- This document was created with pdf \LaTeX atex.
- The \LaTeX document class is beamer.