Chapter 8

Recursion With Data Structures

What is in This Chapter?

In the last course, we discussed recursion at a simple level. This chapter explains how to do more complex *recursion* using various data structures. You should understand recursion more thoroughly after this chapter.



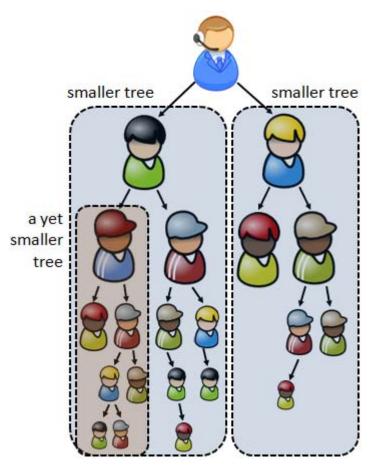
8.1 Examples With Self-Referencing Data Structures

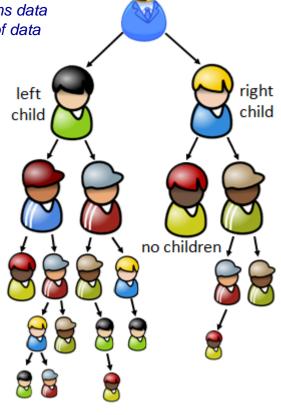
A **binary tree** is a data structure that maintains data in a hierarchical arrangement where each piece of data (called the parent) has exactly two pieces of data (called children) beneath it in the hierarchy.

In computer science we often store information in a binary tree.

The binary tree is similar to the notion of a single gender (i.e., all males or all females) family tree in which every parent has at most 2 children, which are known as the *leftChild* and *rightChild* of their *parent*. It is possible that a *node* in the tree (i.e., a piece of data) may have no children, or perhaps only one child. In this case, we say that the leftChild and/or rightChild is *null* (meaning that it is non-existent).

A node with no children is called a *leaf* of the tree. The *root* of the tree is the data that is at the top of the tree which has no parent.



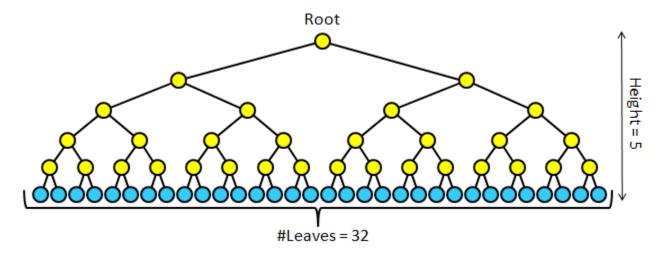


parent

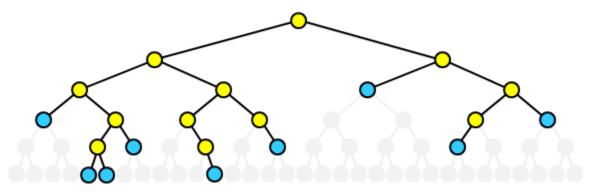
As you may understand from our example of doing a binary search, binary trees can be a very efficient data structure when searching for information. For example as we search for a particular item down the tree from the root, each time that we choose the left or right child to branch down to, we are potentially eliminating half of the remaining data that we need to search through.

Typically, binary trees are represented as recursive data structures. That is, the tree itself is actually made up of other smaller trees. We can see this from the figure on the left, where each non-null child actually represents the root of a smaller tree.

In computer science, trees are often drawn with simple circles as nodes and lines as edges. The *height* of a tree is the depth of the tree from root to the leaves. Here is an example of a *complete* tree (i.e., one that is completely filled with nodes) of height 5. A complete binary tree has **2**^h leaves (where **h** is the tree's height).



In our family tree picture (shown earlier), however, the tree was not complete ... there were nodes missing. Here is how we would draw the equivalent tree for that example:



Notice that it is basically the **2**⁵ binary tree with many of the nodes removed. Notice as well, that the leaves are not necessarily drawn at the bottom of the tree because any node that has no children is considered a leaf.

How can we represent a recursive data structure like this binary tree? Well, remember, each time we break a branch off of a tree, we are left with two smaller trees. So a binary tree itself is made up of two smaller binary trees. Also, since trees are used to store data, each node of the tree should store some kind of information. Therefore, we can create a **BinaryTree** data structure as follows:

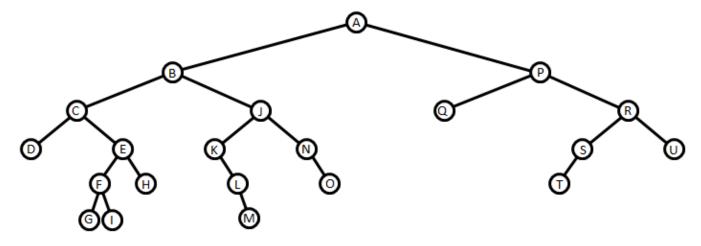
Here, **data** represents the information being stored at that node in the tree ... it could be a String, a number, a Point, or any data structure (i.e., Object) with a bunch of information stored in it.

Notice that the left **leftChild** and **rightChild** are actually binary trees themselves! A tree is therefore considered to be a **self-referential** (i.e., refers to itself) data structure and is thus a naturally recursive data structure.

Likely, we will also create some constructors as well as some get/set methods in the class:

```
public class BinaryTree {
     private String
                           data;
     private BinaryTree
                           leftChild;
     private BinaryTree rightChild;
     // A constructor that takes root data only and
     // makes a tree with no children (i.e., a leaf)
     public BinaryTree(String d) {
           data = d;
           leftChild = null;
           rightChild = null;
     }
     // A constructor that takes root data as well as two subtrees
     // which then become children to this new larger tree.
     public BinaryTree(String d, BinaryTree left, BinaryTree right) {
           data = d;
           leftChild = left;
           rightChild = right;
     // Get methods
     public String getData() { return data; }
     public BinaryTree getLeftChild() { return leftChild; }
     public BinaryTree getRightChild() { return rightChild; }
     // Set methods
     public void setData(String d) { data = d; }
     public void setLeftChild(BinaryTree left) { leftChild = left; }
     public void setRightChild(BinaryTree right) { rightChild = right; }
}
```

To create an instance of **BinaryTree**, we simply call the constructors. Consider a tree with the data for each node being a simple string with a letter character as follows:



Here is a test program that creates this tree:

```
public class BinaryTreeTest {
     public static void main(String[] args) {
           BinaryTree
                           root;
           root = new BinaryTree("A",
                      new BinaryTree("B",
                            new BinaryTree("C",
                                 new BinaryTree("D"),
                                 new BinaryTree("E",
                                       new BinaryTree("F",
                                            new BinaryTree("G"),
                                            new BinaryTree("I")),
                                       new BinaryTree("H"))),
                            new BinaryTree("J",
                                 new BinaryTree("K",
                                       null,
                                       new BinaryTree("L",
                                            null,
                                             new BinaryTree("M"))),
                                 new BinaryTree("N",
                                       null,
                                       new BinaryTree("0")))),
                      new BinaryTree("P",
                            new BinaryTree("O"),
                            new BinaryTree("R",
                                 new BinaryTree("S",
                                       new BinaryTree("T"),
                                       null),
                                 new BinaryTree("U")));
     }
}
```

Example:

When we have such recursive data structures, it is VERY natural to develop recursive functions and procedures that work with them. For example, consider finding the height of this tree. It is not natural to use a **FOR** loop because we have no array or list to loop through.

How can we write a *recursive* function that determines the height of a binary tree ?

We need to determine the base case(s). What is the simplest tree? It is one where the children are **null** (i.e., just a root). In this case, the height is 0.

Here is the code so far as an instance method in the **BinaryTree** class:

```
public int height() {
    if ((this.leftChild == null) && (this.rightChild == null))
        return 0;
}
```

That was easy. Now, for the recursive step, we need to express the height of the tree in terms of the smaller trees (i.e., its children). So, if we knew the height of the **leftChild** and the height of the **rightChild**, how can we determine the height of the "whole" tree?

Well, the height of the tree is one more than the trees beneath it. Assuming that the left and right sub-trees are equal in height, the recursive definition would be:

```
h(tree) = 1 + h(tree.leftChild)
```

However, as you can see from our family tree example, it is possible that the left and right children will have different heights (i.e., 4 and 3 respectively). So, to find the height of the whole tree, we need to take the largest of these sub-trees. So here is our recursive definition:

```
h(tree) = 1 + maximum(h(tree.leftChild), h(tree.rightChild))
```

Here is the code:

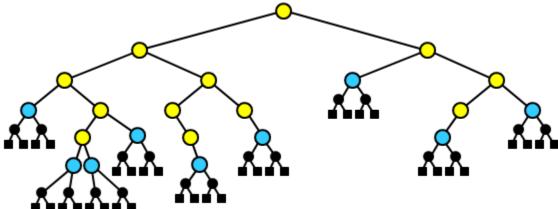
However, there is a slight problem. If one of the children is **null**, but not the other, then the code will likely try to find the **leftChild** or **rightChild** of a **null** tree ... and this will generate a **NullPointerException** in our program. We can fix this in one of two ways:

- (1) check for the case where one child is **null** but not the other
- (2) handle **null** trees as a base case.

Here is the solution for (1):

The above code either checks down one side of the tree or the other when it encounters a tree with only one child. If there are no children, it returns **0**, and otherwise it takes the maximum of the two sub-trees as before.

In choice (2) for dealing with **null** children, it is simpler just to add a base-case for handling **null** tree roots. However this requires the addition of extra nodes. That is, instead of having a child set to **null**, we can have a special tree node that represents a **dummy** tree and simply have all leaves point to that special tree node. In a sense, then, these dummy tree nodes become the leaves of the tree:



In the above picture, the black circles are **BinaryTree** objects and the black boxes indicate that the values of the left and right children are **null**. So, the example above adds 18 dummy nodes to the tree. The dummy nodes are known as ...

A **Sentinel Node** (or **Sentinel**) is a node that represents a path terminator. It is a specifically designated node that is not a data node of the data structure.

Sentinels are used as an alternative over using **null** as the path terminator in order to get one or more of the following benefits: (1) Increased speed of operations; (2) Reduced algorithmic code size; (3) Increased data structure robustness (arguably).

How do we make a sentinel? It is simply a regular **BinaryTree** but has its data value (and children) set to **null** as follows:

```
new BinaryTree(null, null, null)
```

If we decide to use sentinel tree nodes, then we need to add a constructor, perhaps a default constructor and then make changes to the other constructors as necessary to use sentinel nodes instead of **null**.

```
public class BinaryTree2 {
     private String
                           data;
     private BinaryTree2 leftChild;
     private BinaryTree2 rightChild;
     // A constructor that makes a Sentinel node
     public BinaryTree2() {
           data = null;
           leftChild = null;
           rightChild = null;
     }
     // This constructor now uses sentinels for terminators instead of null
     public BinaryTree2(String d) {
           data = di
           leftChild = new BinaryTree2();
           rightChild = new BinaryTree2();
     }
     // This constructor is unchanged
     public BinaryTree2(String d, BinaryTree2 left, BinaryTree2 right) {
          data = d;
           leftChild = left;
           rightChild = right;
     }
     // Get methods
     public String getData() { return data; }
     public BinaryTree2 getLeftChild() { return leftChild; }
     public BinaryTree2 getRightChild() { return rightChild; }
```

```
// Set methods
public void setData(String d) { data = d; }
public void setLeftChild(BinaryTree2 left) { leftChild = left; }
public void setRightChild(BinaryTree2 right) { rightChild = right; }
}
```

Now, we can re-write the test case to replace **null** with the new Sentinel nodes:

```
public class BinaryTreeTest2 {
     public static void main(String[] args) {
           BinaryTree2
                           root;
           root = new BinaryTree2("A",
                      new BinaryTree2("B",
                            new BinaryTree2("C",
                                 new BinaryTree2("D"),
                                 new BinaryTree2("E",
                                       new BinaryTree2("F",
                                             new BinaryTree2("G"),
                                             new BinaryTree2("I")),
                                       new BinaryTree2("H"))),
                            new BinaryTree2("J",
                                 new BinaryTree2("K",
                                       new BinaryTree2(),
                                       new BinaryTree2("L",
                                            new BinaryTree2(),
                                             new BinaryTree2("M"))),
                                 new BinaryTree2("N",
                                       new BinaryTree2(),
                                       new BinaryTree2("O")))),
                      new BinaryTree2("P",
                            new BinaryTree2("Q"),
                            new BinaryTree2("R",
                                 new BinaryTree2("S",
                                       new BinaryTree2("T"),
                                       new BinaryTree2()),
                                 new BinaryTree2("U")));
     }
}
```

Now we will see the advantage of doing all this. We can re-write the **height()** method so that it does not need to check whether or not the children are **null**, but simply needs to stop the recursion if a sentinel node has been reached:

Notice that since the sentinel nodes have added an extra level to the tree, when we reach a sentinel node, we can indicate a **-1** value as the height so that the path from the leaf to the sentinel does not get counted (i.e., it is essentially subtracted afterwards).

The code is MUCH shorter and simpler. This is the advantage of using sentinels ... we do not have to keep checking for **null** values in our code.

Example:

How could we write code that gathers the leaves of a tree and returns them? Again, we will use recursion. In our example, we had 9 leaves. A leaf is identified as having no children, so whenever we find such a node we simply need to add it to a collection.



We can use an **ArrayList<String>** to store the node data. The base case is simple. If the **BinaryTree** is a leaf, return an **ArrayList** with the single piece of data in it:

```
public ArrayList<String> leafData() {
    ArrayList<String> result = new ArrayList<String>();

    if (this.leftChild == null) {
        if (this.rightChild == null)
            result.add(this.data);
    }

    return result;
}
```

Now what about the recursive part? Well, we would have to check both sides of the root as we did before, provided that they are not **null**. Each time, we take the resulting collection of data and merge it with the result that we have so far. The merging can be done using the **list1.addAll(list2)** method in the **ArrayList** class. This method adds all the elements from **list2** to **list1**.

Here is the code:

```
public ArrayList<String> leafData() {
   ArrayList<String> result = new ArrayList<String>();

if (this.leftChild == null) {
   if (this.rightChild == null)
      result.add(this.data);
   else
      result.addAll(this.rightChild.leafData());
   }
  else {
    result.addAll(this.leftChild.leafData());
   if (this.rightChild != null)
      result.addAll(this.rightChild.leafData());
   }
  result.addAll(this.rightChild.leafData());
  }
  return result;
}
```

What would this code look like with the Sentinel version of our tree? Simpler ...

```
public ArrayList<String> leafData() {
   ArrayList<String> result = new ArrayList<String>();

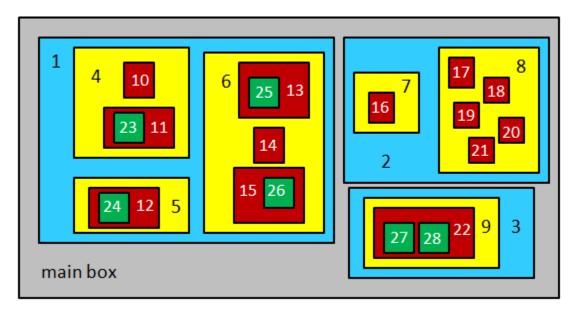
if (this.data != null) {
   if ((this.leftChild.data == null) && (this.rightChild.data == null))
        result.add(this.data);
   result.addAll(this.leftChild.leafData());
   result.addAll(this.rightChild.leafData());
}
return result;
}
```

There are many other interesting methods you could write for trees. You will learn more about this next year.

Example:

As another example, consider the following scenario. You wrap up your friends gift in a box ... but to be funny, you decide to wrap that box in a box and that one in yet another box. Also, to fool him/her you throw additional wrapped boxes inside the main box.

This boxes-within-boxes scenario is recursive. So, we have boxes that are completely contained within other boxes and we would like to count how many boxes are completely contained within any given box. Here is an example where the outer (gray) box has 28 internal boxes:



Assume that each box stores an ArrayList of the boxes inside of it. We would define a box then as follows:

```
import java.util.ArrayList;

public class Box {
    private ArrayList<Box> internalBoxes;

    // A constructor that makes a box with no boxes in it
    public Box() {
        internalBoxes = new ArrayList<Box>();
    }

    // Get method
    public ArrayList<Box> getInternalBoxes() { return internalBoxes; }

    // Method to add a box to the internal boxes
    public void addBox(Box b) {
        internalBoxes.add(b);
    }

    // Method to remove a box from the internal boxes
    public void removeBox(Box b) {
        internalBoxes.remove(b);
    }
}
```

We could create a box with the internal boxes as shown in our picture above as follows:

```
public class BoxTest {
     public static void main(String[] args) {
                 mainBox, a, b, c, d, e, f, g, h, i, j;
            Box
            mainBox = new Box();
            // Create the left blue box and its contents
            a = new Box();
                                   // box 10
                                    // box 11
            b = new Box();
                                   // box 23
            b.addBox(new Box());
                                    // box 4
            c = new Box();
            c.addBox(a);
            c.addBox(b);
            d = new Box();
                                   // box 12
            d.addBox(new Box());
                                   // box 24
                                    // box 5
            e = new Box();
            e.addBox(d);
                                    // box 13
            f = new Box();
            f.addBox(new Box());
                                    // box 25
            g = new Box();
                                    // box 14
                                   // box 15
            h = new Box();
            h.addBox(new Box());
                                   // box 26
            i = new Box();
                                    // box 6
                                                main box
            i.addBox(f);
            i.addBox(q);
            i.addBox(h);
                                   // box 1
            j = new Box();
            j.addBox(c);
            j.addBox(e);
            j.addBox(i);
            mainBox.addBox(j);
            // Create the top right blue box and its contents
            a = new Box();
                                   // box 7
                                    // box 16
            a.addBox(new Box());
                                   // box 8
            b = new Box();
                                   // box 17
            b.addBox(new Box());
                                    // box 18
            b.addBox(new Box());
                                    // box 19
            b.addBox(new Box());
                                   // box 20
            b.addBox(new Box());
                                   // box 21
            b.addBox(new Box());
                                   // box 2
            c = new Box();
            c.addBox(a);
            c.addBox(b);
            mainBox.addBox(c);
            // Create the bottom right blue box and its contents
                                   // box 22
            a = new Box();
                                    // box 27
            a.addBox(new Box());
                                   // box 28
            a.addBox(new Box());
                                    // box 9
            b = new Box();
            b.addBox(a);
            c = new Box();
                                   // box 3
            c.addBox(b);
            mainBox.addBox(c);
      }
```

Now, how could we write a function to unwrap a box (as well as all boxes inside of it until there are no more) and return the number of boxes that were unwrapped in total (including the outer box)?

Do you understand that this problem can be solved recursively, since a **Box** is made up of other **Boxes**? The problem is solved similarly to the binary tree example since we can view the main box as the "root" of the tree while the boxes inside of it would be considered the children (possibly more than 2).

What is the base case(s)? What is the simplest box? Well, a box with no internal boxes would be easy to unwrap and then we are done and there is a total of 1 box:

```
public int unwrap() {
    if (numInternalBoxes == 0)
        return 1;
}
```

This is simple. However, what about the recursive case? Well, we would have to recursively unwrap and count all inside boxes. So we could use a loop to go through the internal boxes, recursively unwrapping them one-by-one and totaling the result of each recursive unwrap call as follows:

```
public int unwrap() {
    if (internalBoxes.size() == 0)
        return 1;
    // Count this box
    int count = 1;

    // Count each of the inner boxes
    for (Box b: internalBoxes)
        count = count + b.unwrap();
    return count;
}
```

Notice how we adjusted the base case. The **for** loop will attempt to unwrap all internal boxes recursively. If there are no internal boxes, then the method returns a value of 1 ... indicating this single box.

Each recursively-unwrapped box has a corresponding **count** representing the number of boxes that were inside of it (including itself). These are all added together to obtain the result.

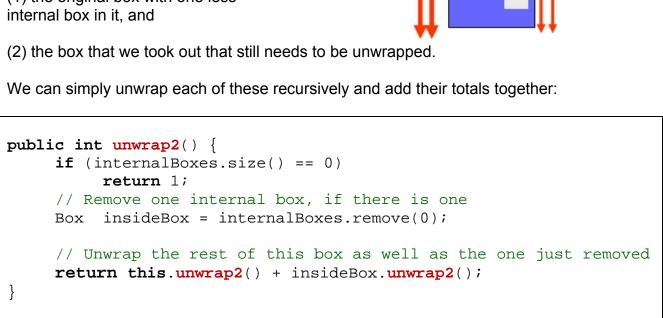
The above code does not modify the **internalBoxes** list for any of the boxes. That is, after the function has completed, the box data structure remains intact and unmodified. This is known as a **non-destructive** solution because it does destroy (or alter) the data structure.

In real life however, the boxes are actually physically opened and the contents of each box is altered so that when completed, no box is contained in any other boxes (i.e., the list is modified/destroyed).

Alternatively, we can obtain the same solution without a for loop by allowing the arrayLists to be destroyed along the way. This would be called a **destructive** solution. Destructive solutions are often simpler to code and understand, but they have the disadvantage of a modified data structure, which can be undesirable in some situations. Here is the process depicting a portion of such a destructive solution: →

How does this simplify our code ? If we are not worried about keeping the innerBoxes lists intact, we can simply "bite-off" a piece of our problem by removing one box from the main box (i.e., taking it out of the list of internal boxes) and then we have two smaller problems:

(1) the original box with one less



This is much smaller code now. It is also intuitive when you make the connection to the real-life strategy for unwrapping the boxes.

Of course, once the method completes ... the main box is empty ... since the boxes were removed from the array list along the way. If we wanted to ensure that the main box remained the same, we could put back the boxes after we counted them. This would have to be done AFTER the recursive calls ... but before the **return** statement:

```
public int unwrap3() {
   if (internalBoxes.size() == 0)
      return 1;

   // Remove one internal box, if there is one
   Box insideBox = internalBoxes.remove(0);

   // Unwrap the rest of this box as well as the one just removed
   int result = this.unwrap3() + insideBox.unwrap3();

   // Put the box back in at position 0 (i.e., same order)
   internalBoxes.add(0,insideBox);

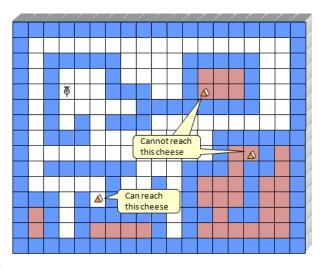
   return result;
}
```

This method is now considered *non-destructive* because the boxes are restored before the method completes.

8.2 A Maze Searching Example

Recall the example last term in which a rat followed the walls of a maze. The rat was able to travel repeatedly around the maze using the "right-hand rule". Consider now mazes that may have areas that are unreachable (e.g., interior rooms of a building with closed doors). We would like to write a program that determines whether or not a rat can reach a piece of cheese that is somewhere else in the maze.

This problem cannot be solved by simply checking each maze location one time. It is necessary to trace out the steps of the rat to determine whether or not there exists a path from the rat to the cheese.



To do this, we need to allow the rat to try all possible paths by propagating (i.e., spreading) outwards from its location in a manner similar to that used in our fire-spreading model that we implemented last term as well.

Unlike the fire-spread example, we do not have to process the locations in order of their distance from the rat's start location. Instead, we can simply allow the rat to keep walking in some direction until it has to turn, and then choose which way to turn. When there are no more places to turn to (e.g., a dead end), then we can return to a previous "crossroad" in the maze and try a different path.

We will need to define a **Maze** class that the **Rat** can move in. Here is a basic class that allows methods for creating and displaying a Maze as well as adding, removing and querying walls:

```
public class Maze {
     public static byte EMPTY = 0;
     public static byte WALL = 1;
     public static byte CHEESE = 2;
     private int
                      rows, columns;
     private byte[][] grid;
     // A constructor that makes a maze of the given size
     public Maze(int r, int c) {
           rows = r;
           columns = c;
           grid = new byte[r][c];
      // A constructor that makes a maze with the given byte array
     public Maze(byte[][] g) {
           rows = g.length;
           columns = g[0].length;
           grid = g;
      // Return true if a wall is at the given location, otherwise false
     public boolean wallAt(int r, int c) { return grid[r][c] == WALL;
     // Return true if a cheese is at the given location, otherwise false
     public boolean cheeseAt(int r, int c) { return grid[r][c] == CHEESE; }
     // Put a wall at the given location
     public void placeWallAt(int r, int c) { grid[r][c] = WALL; }
     // Remove a wall from the given location
     public void removeWallAt(int r, int c) { grid[r][c] = EMPTY; }
     // Put cheese at the given location
     public void placeCheeseAt(int r, int c) { grid[r][c] = CHEESE; }
     // Remove a cheese from the given location
     public void removeCheeseAt(int r, int c) { grid[r][c] = EMPTY;
                                                              МММММММММММММММММ
     // Display the maze in a format like this ----->
                                                              M MMMMM
     public void display() {
                                                                      Wc W W
           for(int r=0; r<rows; r++) {
                                                              W W WWW W W
                 for (int c = 0; c<columns; c++) {</pre>
                                                              W W
                                                                   WWWWWWW W
                       if (grid[r][c] == WALL)
                                                              M MMM
                             System.out.print("W");
                       else if (grid[r][c] == CHEESE)
                                                              W WWWWWW W
                                                              w www w
                             System.out.print("c");
                                                              wwwwwwww
                       else
                                                              W WW WWWWWW W W
                                                              WWW
                                                                   W W
```

WWWWWWWWWWWWWW

```
System.out.print(" ");
          System.out.println();
// Return a sample maze corresponding to the one in the notes
public static Maze sampleMaze() {
     [1,0,1,1,1,1,1,0,0,0,0,1,1,1,1,1,0,0,1},
                     {1,0,1,0,0,0,1,0,0,0,0,1,0,0,1,0,0,1},
                     {1,0,1,0,0,0,1,1,1,1,0,0,1,0,0,1,0,0,1,0,0,1},
                     {1,0,1,0,0,0,0,1,1,1,1,1,1,1,1,1,0,0,1},
                     {1,0,1,0,1,0,1,1,1,0,0,0,0,0,0,0,0,0,1},
                     {1,0,1,1,1,0,0,0,0,0,0,0,1,1,1,1,1,1,1},
                     {1,0,0,0,0,0,0,0,0,0,0,0,0,1,0,0,1,0,1},
                     {1,0,1,1,1,1,1,1,0,0,0,1,1,1,0,1,1,0,1},
                     {1,0,0,0,0,1,0,1,0,1,0,1,0,0,0,1,0,0,1},
                     {1,1,1,0,1,0,1,0,0,1,0,1,0,0,0,1,0,0,1},
                     {1,0,1,0,1,1,1,1,1,1,0,1,1,0,1,1,0,0,1},
                    {1,0,1,0,1,0,0,0,0,1,0,1,0,0,0,0,0,0,1},
                    Maze m = new Maze(grid);
     m.placeCheeseAt(3,12);
     return m;
}
```

What does the **Rat** class look like? It is very simple, for now:

```
public class Rat {
    private int row, col;

    // Move the Rat to the given position
    public void moveTo(int r, int c) {
        row = r; col = c;
    }
}
```

Let us see whether or not we can write a recursive function in the **Rat** class to solve this problem. The function should take as parameters the maze (i.e., a 2D array). It should return **true** or **false** indicating whether or not the cheese is reachable from the rat's location. Consider the method written in a **Rat** class as follows:

```
public boolean canFindCheeseIn(Maze m) {
    ...
}
```

What are the base cases for this problem? What is the simplest scenario? To make the code simpler, we will assume that the entire maze is enclosed with walls ... that is ... the first row, last row, first column and last column of the maze are completely filled with walls.

There are two simple cases:

- 1. If the cheese location is the same as the rat's location, we are done ... the answer is true.
- 2. If the rat is on a wall, then it cannot move, so the cheese is not reachable. This is a kind of error-check, but as you will see later, it will simplify the code.

Here is the code so far:

```
public boolean canFindCheeseIn(Maze m) {
    // Return true if there is cheese at the rat's (row,col) in the maze
    if (m.cheeseAt(row, col))
        return true;

    // Return false if there is a wall at the rat's (row,col) in the maze
    if (m.wallAt(row, col))
        return false;
}
```

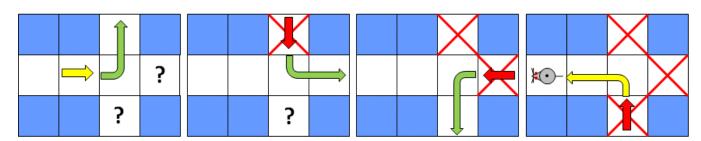
Notice that the **row** and **col** variables are the attributes of the **Rat** itself.

Now what about the recursion? How do we "break off" a piece of the problem so that the problem becomes smaller and remains the same type of problem? Well, how would you solve the problem if you were the rat looking for the cheese?

Likely, you would start walking in some direction looking for the cheese. If there was only one single path in the maze you would simply follow it. But what do you do when you come to a crossroads (i.e., a location where you have to make a decision as to which way to go)?

Probably, you will choose one of these unexplored hallways, and then if you find the cheese ... great. If you don't find the

cheese down that hallway, you will likely come back to that spot and try a different hallway. If you find the cheese down any one of the hallways, your answer is **true**, otherwise...if all hallways "came up empty" with no cheese, then you have exhausted all possible routes and you must return **false** as an answer for this portion of the maze:



So the idea of "breaking off" a smaller piece of the problem is the same idea as "ruling out" one of the hallways as being a possible candidate for containing the cheese. That is, each time we check down a hallway for the cheese and come back, we have reduced the remaining maze locations that need to be searched.

This notion can be simplified even further through the realization that each time we take a step to the next location in the maze, we are actually reducing the problem since we will have already checked that location for the cheese and do not need to re-check it. That is, we can view each location around the rat as a kind of hallway that needs to be checked. So, the general idea for the recursive case is as follows:

if (the cheese is found on the path to the left) then return true otherwise if (the cheese is found on the path straight ahead) then return true otherwise if (the cheese is found on the path to the right) then return true otherwise return false

There are only three possible cases, since we do not need to check behind the rat since we just came from that location. However, the actual code is a little more complicated. We need, for example, to determine the locations on the "left", "ahead" and "right" of the rat, but this depends on which way the rat is facing. There would be the three cases for each of the 4 possible rat-facing directions. A simpler strategy would simply be to check all 4 locations around the rat's current location, even though the rat just came from one of those locations. That way, we can simply check the 4 maze locations in the array around the rat's current location. Here is the idea behind the recursive portion of the code:

move the rat up

if (canFindCheese(maze)) then return true otherwise move the rat back down

move the rat down

if (canFindCheese(maze)) then return true otherwise move the rat back up

move the rat left

if (canFindCheese(maze)) then return true otherwise move the rat back right

move the rat right

if (canFindCheese(maze)) then return true otherwise move the rat back left

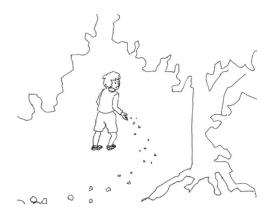
return false

The code above has 4 recursive calls. It is possible that all 4 recursive calls are made and that none of them results in the cheese being found.

However, there is a problem in the above code. With the above code, the rat will walk back and forth over the same locations many times ... in fact ... the code will run forever ... it will not stop. The problem is that each time we call the function recursively, we are not reducing the problem. In fact, each time, we are simply starting a brand new search from a different location.

The rat needs a way of "remembering" where it has been before so that it does not "walk in circles" and continue checking the same maze locations over and over again. To do this, we need to leave a kind of "breadcrumb trail" so that we can identify locations that have already been visited.

We can leave a "breadcrumb" at a maze location by changing the value in the array at that row and column with a non-zero & non-wall value such as -1. Then, we can treat all -1 values as if they are walls by not going over those locations again.



We can add code to the **Maze** class to do this:

```
public static byte BREAD_CRUMB = -1;

// Mark the given location as visited
public void markVisited(int r, int c) {
        grid[r][c] = BREAD_CRUMB;
}

// Mark the given location as not having been visited
public void markUnVisited(int r, int c) {
        grid[r][c] = EMPTY;
}

// Return true of the location has been visited
public boolean hasBeenVisited(int r, int c) {
        return grid[r][c] == BREAD_CRUMB;
}
```

Now we can adjust our code to avoid going to any "visited locations" and to ensure that each location is visited. We can also put in the code to do the recursive checks now as follows:

```
public boolean canFindCheeseIn(Maze m) {
    // Return true if there is cheese at the rat's (row,col) in the maze
    if (m.cheeseAt(row, col))
        return true;

    // Return false if there is a wall at the rat's (row,col) in the maze
    if (m.wallAt(row, col) || m.hasBeenVisited(row, col))
        return false;

    // Mark this location as having been visited
    m.markVisited(row, col);

    // Move up in the maze and recursively check
    moveTo(row-1, col);
    if (canFindCheeseIn(m))
        return true;
```

```
// Move back down and then below in the maze and recursively check
moveTo(row+2, col);
if (canFindCheeseIn(m)) return true;

// Move back up and then left in the maze and recursively check
moveTo(row-1, col-1);
if (canFindCheeseIn(m)) return true;

// Move back and then go right again in the maze and recursively check
moveTo(row, col+2);
if (canFindCheeseIn(m)) return true;

// We tried all directions and did not find the cheese, so quit
return false;
}
```

Notice that we are now returning with **false** if the location that the rat is at is a wall or if it is a location that has already been travelled on. Also, we are setting the rat's current maze location to **-1** so that we do not end up coming back there again.

After running this algorithm, the maze will contain many -1 values. If we wanted to use the same maze and check for a different cheese location, we will need to go through the maze and replace all the -1 values with 0 so that we can re-run the code. This recursive function is therefore considered to be destructive. Destructive functions are not always desirable since they affect the outcome of successive function calls.

However, there is a way to fix this right in the code itself. Notice that we are setting the maze location to **-1** just before the recursive calls. This is crucial for the algorithm to work. However, once the recursive calls have completed, we can simply restore the value to **0** again by placing the following just before each of the **return** calls:

```
m.markUnVisited(row, col);
```

For example:

The code above should now do what we want it to do.

We need to test the code. To help debug the code it would be good to be able to display where the rat is and where the breadcrumbs are.

We can modify the **display()** method in the **Maze** class to take in the rat's location and do this as follows:

```
public void display(int ratRow, int ratCol) {
     for(int r=0; r<rows; r++) {</pre>
           for (int c = 0; c < columns; c++) {
                 if ((r == ratRow) && (c == ratCol))
                       System.out.print("r");
                 else if (grid[r][c] == WALL)
                       System.out.print("W");
                 else if (grid[r][c] == CHEESE)
                       System.out.print("c");
                 else if (grid[r][c] == BREAD_CRUMB)
                       System.out.print(".");
                 else
                       System.out.print(" ");
           System.out.println();
     }
}
```

We can then use the following test program:

Also, by inserting **m.display(row,col)**; at the top of your recursive method, you can watch as the rat moves through the maze:

```
WWWWWWWWWWWWW
                  WWWWWWWWWWWWWW
                                     WWWWWWWWWWWWW
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                                                        W.r....W
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```

In the above case, the cheese was not found after an exhaustive search.

8.3 A Note on Efficiency

Although recursion is a powerful problem solving tool, it has some drawbacks. A non-recursive (or iterative) method may be **more** efficient than a recursive one for two reasons:

- 1. there is an overhead associated with large number of method calls
- 2. some algorithms are inherently inefficient.

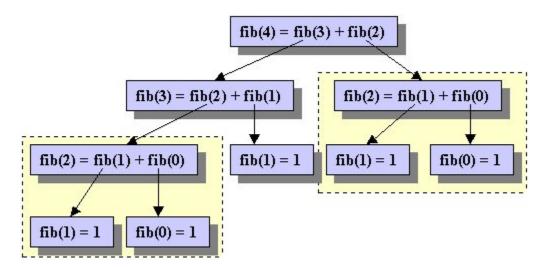
For example, computing the **n**th Fibonacci number can be written as:

```
1 if n = 0
fib(n) = 1 if n = 1
fib(n-1) + fib(n-2) if n > 1
```

A straight-forward recursive solution to solving this problem would be as follows:

```
public static int fibonacci(int n) {
    if (n <= 1)
        return 1;
    return fibonacci(n-1) + fibonacci(n-2);
}</pre>
```

However, notice what is happening here:



In the above computation, some problems (e.g., **fibonacci(2)**) are being solved more than once, even though we presumably know the answer after doing it the first time. This is an example where recursion can be inefficient if we do not do it carefully.

The following iterative solution avoids the re-computation:

Notice how the previous two results are always stored in the **first** and **second** variables. So the computation need not be duplicated.

We can do this recursively ... we just need to keep track of previous computations.

```
public static int fibonacci(int n, int prev, int prevPrev) {
    if (n <= 0)
        return prev + prevPrev;
    else
        return fibonacci(n-1, prev + prevPrev, prev);
}</pre>
```

We essentially use the same idea of keeping track of the last two computations and passing them along to the next recursive call. However, we would have to start this off with some values for these parameters. For example to find the 20th Fibonacci number, we could do this:

```
fibonacci(18, 1, 1);
```

The first two numbers are 1 and then there are 18 more to find.

However, this is not a nice solution because the user of the method must know what the proper values are in order to call this method. It would be wise to make this method **private** and then provide a **public** one that passes in the correct initial parameters as follows:

```
public static int fibonacci3(int n) {
    if (n <= 1)
        return 1;
    return fibonacci(n-2, 1, 1); // calls above method
}</pre>
```

This method in itself is not recursive, as it does not call itself. However, indirectly, it does call the 3-parameter **fibonacci()** method ... which is recursive. We call this kind of method indirectly recursive.

An **indirectly recursive** function is one that does not call itself, but it does call a recursive method.

Indirect recursion is mainly used to supply the initial parameters to a recursive function. It is the one that the user interacts with. It is often beneficial to use recursion to improve efficiency as well as to create non-destructive functions.

8.4 Dynamic Programming

Consider the brief discussion of efficiency above. Remember that without being careful, we may end up with a solution that is inefficient in that some computations are repeated. Well, dynamic programming is used to reduce such inefficiencies.

Dynamic programming is an optimization method for solving complex problems by breaking them down into simpler sub problems in a way that reduces the need to recalculate sub problems.

The idea behind dynamic programming is quite simple.

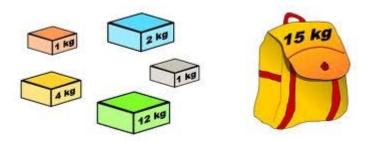
In general, to solve a given problem, we can break it down into sub problems which are solved individually. Then, we can combine the solutions of the sub problems to reach an overall solution. In the cases where the sub problems are the same, we can use dynamic programming which will try to ensure that each sub problem is solved only once, thereby reducing the number of computations.

If the sub problems do not overlap (i.e., there are few repeated computations), then we are not officially doing dynamic programming ... but instead ... simply doing a **divide-and-conquer** approach.

The optimization problem is motivated by the *knapsack problem*. Imagine that you have a knapsack that has a maximum weight capacity of W_{max} (e.g., the knapsack can hold at most 15_{kg} of items). Now, you have several items (i.e., e_1 , e_2 , e_3 , ..., e_n) that you want to place in the knapsack. Each item e_i has a specific **weight W**_i and has a **value V**_i (i.e., which may be the price of the item, or anything that represents the benefit of having it in the knapsack).

The knapsack problem is to place a certain # of copies of each item e_i in the knapsack so that

- 1. the knapsack weight capacity is not exceeded and
- 2. the total value of items in the knapsack is maximized.



This sounds like a simple problem ... but it is actually not intuitive to solve.

Suppose $f(W_{max})$ represents the *maximal possible value* of a knapsack with weight W_{max} . In our example, we want to determine f(15) since the bag can hold 15kg. For a general bag, however, what can we say about the function f()?

Well, assuming that we are manually filling the bag by adding the items one at a time, we are adding the items in some order. Suppose that the last item just added was item $\mathbf{e_i}$ with weight $\mathbf{w_i}$ and benefit $\mathbf{v_i}$. Just before we added the item, the knapsack had optimal weight of $(\mathbf{W_{max}} - \mathbf{w_i})$. We chose to add $\mathbf{e_i}$ to the knapsack because ... of all items with weight $\mathbf{w_i}$ or less, $\mathbf{e_i}$ had the maximum value $\mathbf{v_i}$. Therefore,

$$f(\mathbf{W}_{max}) = \mathbf{MAX}\{\mathbf{v}_i + f(\mathbf{W}_{max} - \mathbf{w}_i) \mid \mathbf{e}_i\}$$

The formula essentially indicates to look at all items $\mathbf{e_1}$, $\mathbf{e_2}$, $\mathbf{e_3}$, ..., $\mathbf{e_n}$ and choose the one that provides the best value overall. Note that it is not the one with the highest value ... but instead ... we measure the combined value with the recursive value of $\mathbf{f()}$, which takes into account the item's weight. As you can see, the result is a recursive function definition.

The knapsack problem has many applications. Any time that we see a situation in which there is a fixed budget (i.e., a fixed amount of resources) and there are a sequence of options, each with a cost and a value, and we must select a subset of them online so as to maximize the total value ... then the knapsack problem comes into play. Here are a few example situations:

- wasteful cutting of raw materials
- selection of capital investments and financial portfolios
- hiring workers
- scheduling jobs

There are also other variations of dynamic programming, but it is too much to cover in this course. We will just give an idea here as to how we can write some a simple program for solving the knapsack problem for a couple of simple examples.

Example:

Consider filling up a 5kg capacity knapsack with some simple fire-fighting items. We have 3 types of items as shown with their individual weights and value as follows:



The value of each item *could* pertain to its fire-fighting potential. Assuming that we have unlimited quantities of each item, which items should we place in the 5kg knapsack to maximize the fire-fighting potential of the knapsack?

We can compute **f(5kg)** as we defined earlier. Let us look at the value of **f()** for various knapsacks:

- **f(0)** = 0 since a knapsack with zero capacity cannot hold anything
- **f(1)** = 0 as well since all items are more than 1kg in weight
- **f(2)** = 6 since only the **salt** can fit in such a knapsack
- $f(3) = MAX\{ (6+f(3-2)), (7.5+f(3-3)) \} = MAX\{ (6+0), (7.5+0) \} = 7.5 \dots$ choose the water
- $f(4) = MAX\{ (6+f(4-2)), (7.5+f(4-3)), (9+f(4-4)) \}$
 - $= MAX{ (6+6), (7.5+0), (9+0) } = MAX{ 12, 7.5, 9 } = 12$
 - = choose two bags of salt
- $f(5) = MAX{ (6+f(5-2)), (7.5+f(5-3)), (9+f(5-4)) }$
 - $= MAX\{ (6+7.5), (7.5+6), (9+0) \} = MAX\{ 13.5, 13.5, 9 \} = 13.5$
 - = choose salt and water

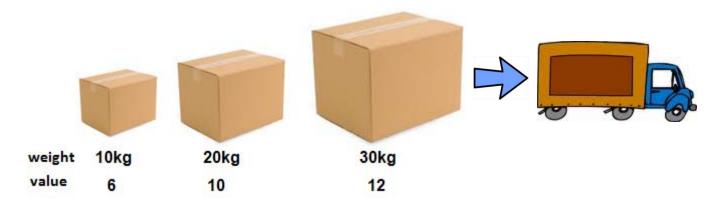
So for a **5kg** knapsack, the optimal value is **13.5** ... which is to choose one bag of salt and one pack of water. In fact, there are two possible optimal solutions:

- 1. Choose the salt during computation of f(5) and choose the water in computation of f(3).
- 2. Choose the water during computation of **f(5)** and choose the salt in computation of **f(2)**.

Notice how the solution for **f(5)** makes repeated computations of **f(1)**, **f(2)**, **f(3)** and **f(4)** along the way.

Example:

Consider now a delivery truck that is able to carry some boxes. The truck can take at most **50kg** more weight (because it already has some items loaded inside of it). Consider a bunch of 10kg, 20kg and 30kg boxes that need delivering with the value of each box shown below? How many of each type of box should be taken this time around onto the truck?



Once again, we can compute **f()** for various truck capacities:

```
 f(0), f(1), ..., f(9) = 0 \text{ since a truck with } < 10 \text{kg capacity cannot hold any of these boxes} \\ f(10), f(11), ..., f(19) = 6 \text{ since only the 10 kg box can fit inside} \\ f(20), f(21), ..., f(29) = MAX{ (6+f(10)), (10+f(0)) } = MAX{ (6+6), (10+0) } = 12 \\ &= \text{choose two 10 kg boxes.} \\ f(30), f(31), ..., f(39) = MAX{ (6+f(20)), (10+f(10), (12+f(0)) } = MAX{ (6+12), (10+6), (12+0) } \\ &= 18 = \text{choose three 10 kg boxes.} \\ f(40), f(41), ..., f(49) = MAX{ (6+f(30)), (10+f(20), (12+f(10)) } \\ &= MAX{ (6+18), (10+12), (12+6) } \\ &= 24 = \text{choose four 10 kg boxes.} \\ f(50) = MAX{ (6+f(40)), (10+f(30), (12+f(20)) } \\ &= MAX{ (6+24), (10+18), (12+12) } \\ &= 30 = \text{choose five 10 kg boxes.} \\ \end{cases}
```

Interestingly, only the small boxes are chosen! The only way we would end up choosing the larger boxes is if they had a greater value.

You may again notice that the solution for **f(50)** makes repeated computations of **f(49)**, **f(48)**, **f(47)** ... **f(0)** along the way. To solve the problem using dynamic programming, we want to avoid re-computing these values.

To do this, we can maintain an array of computations and build this array up to reach the final solution, making use of previous computations as we go.

Here is an example of how we could set up our arrays for this example:

```
int W_MAX = 5; // weight capacity of knapsack String[] n = {"Salt", "Water", "Extinguisher"}; // names of our 3 items int[] w = {2, 3, 4}; // weights of our 3 items float[] v = {6, 7.5f, 9}; // values of our 3 items
```

Now recall our formula for computing **f()**:

```
f(\mathbf{W}_{max}) = MAX\{V_i + f(\mathbf{W}_{max} - \mathbf{W}_i) \mid \mathbf{e}_i\}
```

Here $\mathbf{v_i}$ and $\mathbf{w_i}$ refer to our arrays $\mathbf{v[i]}$ and $\mathbf{w[i]}$, respectively. We will store the solution to function $\mathbf{f()}$ in an array $\mathbf{f[k]}$ as follows:

```
float[] f = new float[W_MAX+1]; // our solution for each knapsack weight
```

The array **f** will contain the solutions to the problem for various knapsacks ranging from capacities 0, 1, 2, ..., W_{max} . The final solution will be the last entry in the array (i.e., $f[W_{max}]$).

We can come up with an algorithm that iterates through each maximum knapsack weight, filling up the array as we go.

Here is the basic idea behind computing the solution:

```
// Compute the solution by iterating through
// all knapsack weights from 0 to W_MAX
for (int weight=0; weight<=W_MAX; weight++) {
    // Consider each item for this knapsack
    for (int i=0; i<v.length; i++) {
        // Only consider items that are not too heavy (a bounds check)
        if (w[i] <= weight) {
            // If using this item provides a better overall value than not
            // using it (according to our current knowledge), then use it
            if ((v[i] + f[weight-w[i]]) > f[weight]) {
                f[weight] = v[i] + f[weight - w[i]];
            }
        }
    }
}
// Display the results
System.out.println("Knapsack has overall value of " + f[W_MAX]);
```

The result is as follows ... which matches our earlier solution:

```
Knapsack has overall value of 13.5
```

Of course, a more thorough solution would be to show which items are actually placed into the knapsack. To do this, we will need to maintain more information.

Since the solution is recursive in that the heavier knapsack solutions depend on the lighter knapsack solutions ... and ... we are solving the previous knapsack solutions by placing an additional item, we can simply remember the last item added to the knapsack each time and work backwards to find the items that are placed in the lighter knapsacks.

To do this, we need to keep track of two things: (1) the last item that was added for each knapsack weight, and (2) the quantity of each item to use.

We can do this using two arrays as follows:

The **quantity** array holds the number of each item that is to be placed into the knapsack in order to obtain the solution for W_{max} . The **last** array will simply remember the index (or ID) of the item that was the last one added to obtain the solution for each of the knapsack solutions from 0, 1, 2, ..., W_{max} . Initially, we need to set the values of **last** to **-1** to indicate that there are no items yet added for the solution. Then we need to fill it in when we place an item in the knapsack.

Here is an updated loop to fill in the **last** array:

```
// Fill in the quantity of each item with -1 to
// indicate that we do not know anything yet
for (int weight=0; weight<=W_MAX; weight++)</pre>
   last[weight] = -1;
for (int weight=0; weight<=W MAX; weight++) {</pre>
   for (int i=0; i<v.length; i++) {</pre>
       if (w[i] <= weight) {</pre>
           if ((v[i] + f[weight-w[i]]) > f[weight]) {
              f[weight] = v[i] + f[weight - w[i]];
              // Keep track of this newly added item's
              // index for this particular knapsack weight
              last[weight] = i;
           }
       }
   }
}
```

Once this array has been filled up, we can then work backwards through the **last** array (starting with the last item added for the $f(W_{max})$ solution) and increment the quantity of the items as we work backwards for the smaller knapsacks:

As a result, we get the following output:

```
Items to place in knapsack for overall value of 13.5:
   Salt: 1
   Water: 1
   Extinguisher: 0
```

For the second example, we had these values:

Here is the output that we would get in this case:

```
Items to place in knapsack for overall value of 30.0:
   10kg Box: 5
   20kg Box: 0
   30kg Box: 0
```

The complete code is given on the next page ...

```
public class KnapsackTestProgram {
   public static void main(String[] args) {
                  W MAX = 5;
                                                             // weight capacity
                  n = {"Salt", "Water", "Extinguisher"};
                                                             // names
       String[]
                  w = \{2, 3, 4\};
                                                             // weights
       int[]
                  v = \{6, 7.5f, 9\};
                                                             // values
       float[]
       float[] f = new float[W_MAX+1]; // our solution for each knapsack weight
               last = new int[W_MAX+1]; // last item added for each knapsack weight
               quantity = new int[v.length]; // quantity of each item
       // Fill in the quantity of each item with -1 to
       // indicate that we do not know anything yet
       for (int weight=0; weight<=W_MAX; weight++)</pre>
           last[weight] = -1;
       // Compute solution by iterating through all knapsack weights from 0-W_MAX
       for (int weight=0; weight<=W_MAX; weight++) {</pre>
           // Consider each item for this knapsack
           for (int i=0; i<v.length; i++) {</pre>
               // Only consider items that are not too heavy (a bounds check)
               if (w[i] <= weight) {</pre>
                   // If using this item provides a better overall value than not
                   // using it (according to our current knowledge), then use it
                   if ((v[i] + f[weight-w[i]]) > f[weight]) {
                       f[weight] = v[i] + f[weight - w[i]];
                       // Keep track of this newly added item's
                       // index for this particular knapsack weight
                       last[weight] = i;
                   }
               }
           }
       }
       // Determine how many of each item is to be used in the solution
       // Work backwards, placing the last (i.e., best value) item
       // into the knapsack until no more items remain that fit.
       int knapsackCapacity = W_MAX;
       int itemToPlace = last[W_MAX];
       while ((itemToPlace != -1) && (knapsackCapacity > 0)) {
            quantity[itemToPlace]++;
            knapsackCapacity = knapsackCapacity - w[itemToPlace];
            itemToPlace = last[knapsackCapacity];
       // Display the results showing each item name and their quantity
       System.out.println("Items to place in knapsack for overall value of " +
                           f[W_MAX] + ":");
       for (int i=0; i<v.length; i++)</pre>
           System.out.println("
                                  " + n[i] + ": " + quantity[i]);
   }
}
```