

# 6G6Z1109: Software Agents and Optimisation

Add WeChat powcoder  
Term 2, Lecture 8: Assignment, and  
comparative analysis

# Assignment help

- Your solution will require classes to represent a GA individual, the population, and the ordered crossover  
*Assignment (Project Exam Help)*
- It also needs the classes for the circle placement algorithm (Bunch, Circle, and Point). You should not need to make many changes to this code...  
*https://powcoder.com*  
*Add WeChat powcoder*
- The main application should create a Bunch object for *each* of the three algorithms – this allows you to easily display all three

# Assignment help

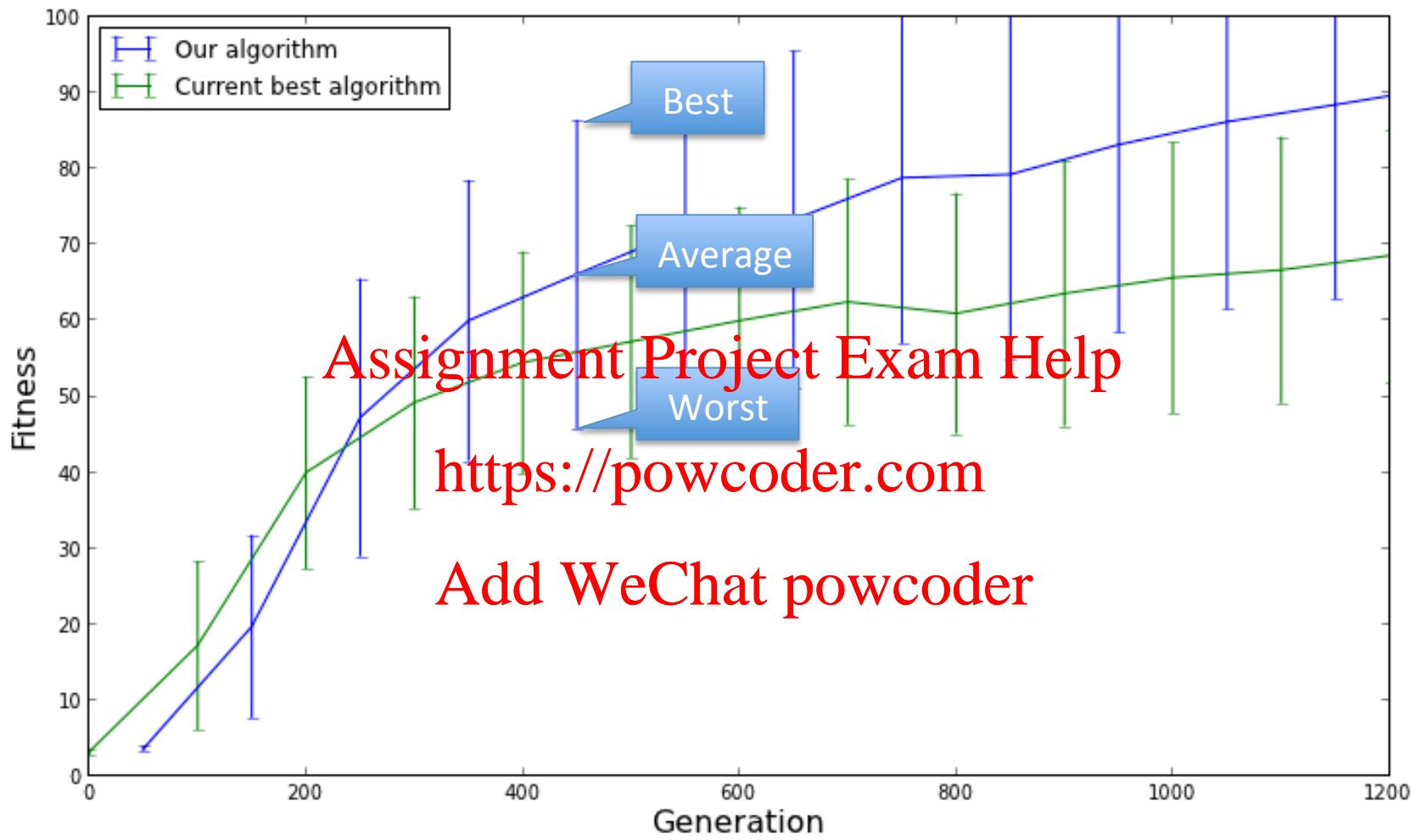
- Your Bunch class should contain a geneticPlace( ) method, which takes in all of the parameters of the GA (that is, it should be entirely self-contained)  
**Assignment Project Exam Help**
- It will be *much* easier to implement if you have already successfully implemented the Population class (as in a previous lab)  
**Add WeChat powcoder**
- Given that we are using an order-based encoding, it's no surprise than an individual's genome should be a list of integers – the ordering of the set of circles
- That is, a genome of “21345”, specifies circle 2 to be placed first, followed by 1, 3, 4, then 5

# Assignment help

- When evaluating an individual's genome in the fitness function, you should realise that you can actually reuse the `orderedPlace()` method that we have already encountered
- You can *overload* this method, by providing a version that *takes in* an ordering (encoded as an array of integers...) and places the circles in that order
- The fitness function in my model answer (located in the `Individual` class) is *extremely short*; it simply creates a temporary `Bunch` of circles, orders them according to the genome, calls the method to compute the boundary, and then returns this as the fitness...

# Assignment help

- When doing a *comparative analysis* of your genetic algorithm (i.e., comparing with greedy search), it is important to specify the parameters used, and investigate the effect of varying these (see previous lecture) <https://powcoder.com>
- Also, it is important to perform *several* runs of your GA, and then take the *average* best fitness found, in order to ensure that you get a representative sample
- How many runs is “enough”? – probably around 30-50
- It is also interesting to plot the *convergence* of your algorithm over time



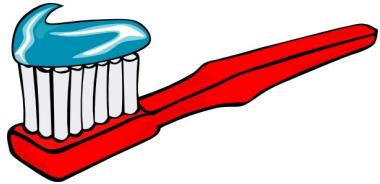
R. Olson

# Encodings

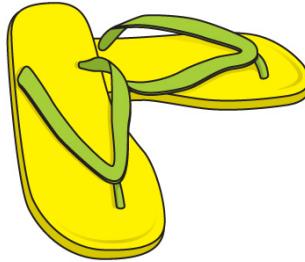
- How we *encode* a solution to our problem is also vital to the success of the GA
- Ideally, our encoding will be expressed as a linear *string* or sequence of items, such as characters, integers, reals, etc.
- An encoding might *directly* represent the objects that are evolving (e.g. strings of text), or *indirectly* represent the presence or absence of objects with certain attributes

# Indirect encoding example

- Consider the following problem: we wish to pack for our holiday, and we have a suitcase with a specific capacity (luggage weight limit)
- We have a set of items, each of which has a *weight* and a *utility* value (that is, how *useful* we find it)
- We wish to find the *set of items* that maximises our utility, whilst staying within the weight limit



Utility: 8  
Weight: 4



Utility: 5  
Weight: 5



Utility: 9  
Weight: 7

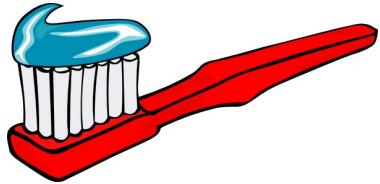
## Assignment Project Exam Help



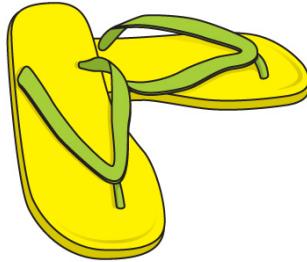
<https://powcoder.com>  
Add WeChat powcoder



Utility: 10  
Weight: 5



Utility: 8  
Weight: 4



Utility: 5  
Weight: 5



Utility: 9  
Weight: 7

## Assignment Project Exam Help



Add WeChat powcoder

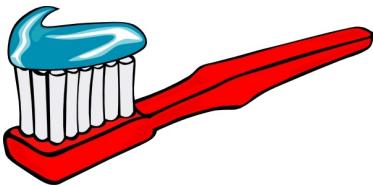


Utility: 10  
Weight: 5

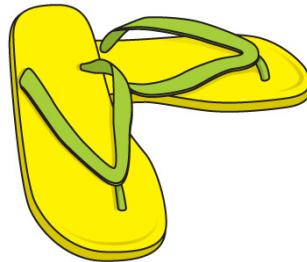
*How do we encode a solution to this problem?*

# Choosing an encoding

- We need to work out what the problem is asking of us...
- It needs us to find a ~~subset of items~~, subject to certain constraints
  - That is, each item is either “in” or “out” of the suitcase
- A solution is a *candidate list of items*, which is then assessed according to the criteria
- In this case, if we *order* the items, a simple *binary encoding* will suffice



Utility: 8  
Weight: 4



Utility: 5  
Weight: 5



Utility: 9  
Weight: 7



Utility: 10  
Weight: 5

## Assignment Project Exam Help

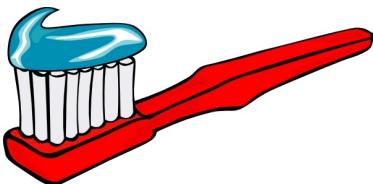
<https://powcoder.com>

Add WeChat powcoder

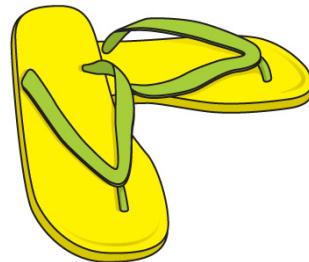
We can now use a simple binary encoding on the ordered list of items, so 1001 represents “include toothbrush and suncream”, whilst 0111 represents “flip-flops, bikini and suncream”



Capacity: 15



Utility: 8  
Weight: 4



Utility: 5  
Weight: 4



Utility: 9  
Weight: 7



Utility: 10  
Weight: 5

## Assignment Project Exam Help

<https://powcoder.com>

We call a *sequence* the *genotype*, as it represents an individual's "genetic code". What a genotype represents or builds is called the *phenotype*, and it is this "body" that we assess or assign a fitness value to.

Add WeChat powcoder



# A *greedy* algorithm

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Add WeChat powcoder

# A greedy algorithm

Profit/weight

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Add WeChat powcoder

# A greedy algorithm

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Assignment Project Exam Help

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Item	Profit	Weight	PTWR
1	6	2	3
2	5	3	1.67
3	8	6	1.33
4	9	7	1.29
5	6	5	1.2
6	7	9	0.78
7	3	4	0.75

Capacity=9

Space=9

Add WeChat powcoder

# A greedy algorithm

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Assignment Project Exam Help

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Item	Profit	Weight	PTWR
1	6	2	3
2	5	3	1.67
3	8	6	1.33
4	9	7	1.29
5	6	5	1.2
6	7	9	0.78
7	3	4	0.75

Capacity=9

Space=7

Add WeChat powcoder

# A greedy algorithm

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Assignment Project Exam Help

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Item	Profit	Weight	PTWR
1	6	2	3
2	5	3	1.67
3	8	6	1.33
4	9	7	1.29
5	6	5	1.2
6	7	9	0.78
7	3	4	0.75

Capacity=9

Space=4

Add WeChat powcoder

# A greedy algorithm

Calculate the *profit-to-weight ratio* for each item

While (we can select an item)

Assignment Project Exam Help

Select item with highest PTWR that keeps us below capacity

<https://powcoder.com>

Item	Profit	Weight	PTWR
1	6	2	3
2	5	3	1.67
3	8	6	1.33
4	9	7	1.29
5	6	5	1.2
6	7	9	0.78
7	3	4	0.75

Capacity=9 Space=0

Add WeChat powcoder

Total profit: 14

# A genetic algorithm

We use a simple binary encoding scheme, with a binary vector  $x=[x_1, \dots, x_n]$  to represent  $n$  items, where  $x[i]=1$  if the item is *included* in the suitcase, and  $x[i]=0$  if it is not

The fitness function for a given solution,  $x$ , is as follows:

We denote the profit of items by  $p[i]$ , and the weights by  $w[i]$

```
total weight = 0      Add WeChat powcoder
for each item, x[i]          // weigh items in suitcase
    if x[i] = 1 then add w[i] to total weight

if total weight <= total capacity
    fitness = 0
    for each item, x[i]          // add profits together
        if x[i] = 1 then add p[i] to fitness
    return fitness
else                                // over capacity
    return capacity-total weight
```

# A genetic algorithm

We use a simple binary encoding scheme, with a binary vector  $x=[x_1, \dots, x_n]$  to represent  $n$  items, where  $x[i]=1$  if the item is *included* in the suitcase, and  $x[i]=0$  if it is not

The fitness function for a given solution,  $x$ , is as follows:

We denote the profit of items by  $p[i]$ , and the weights by  $w[i]$

```
total weight = 0
for each item, x[i]           // weight
    if x[i] = 1 then add w[i] to total weight

if total weight <= total capacity
    fitness = 0
    for each item, x[i]
        if x[i] = 1 then add p[i] to fitness
    return fitness
else
    return capacity-total weight
```

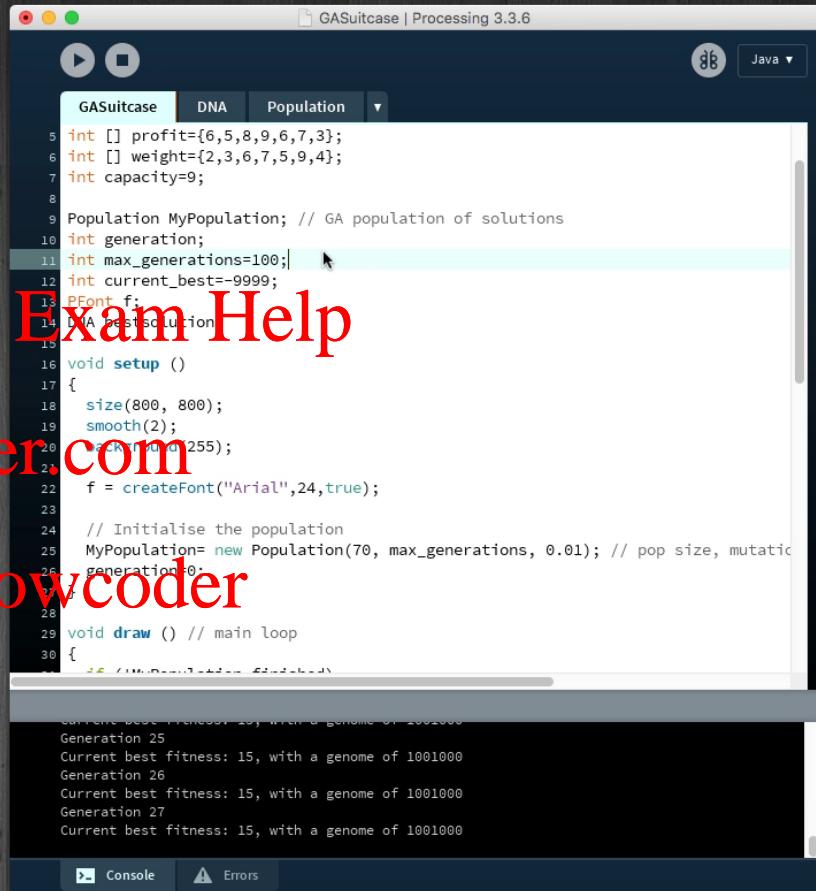
Add WeChat powcoder

Penalise “illegal” solution,  
by essentially giving it a  
negative fitness

# Assignment Project Exam Help

<https://powcoder.com>

Add WeChat powcoder



The screenshot shows the GASuitcase interface for Processing 3.3.6. The code editor displays a Java program for a Genetic Algorithm (GA) to solve a knapsack problem. The code defines variables for profit, weight, and capacity arrays, initializes a population, and sets generation parameters. It includes a setup function to initialize the canvas and a draw function to run the main loop. The console window at the bottom shows the output of the program's execution, which prints the current best fitness and genome for generations 25, 26, 27, and 28.

```
int [] profit={6,5,8,9,6,7,3};  
int [] weight={2,3,6,7,5,9,4};  
int capacity=9;  
  
Population MyPopulation; // GA population of solutions  
int generation;  
int max_generations=100;  
int current_best=-9999;  
PFont f;  
  
void setup ()  
{  
    size(800, 800);  
    smooth(2);  
    background(255);  
    f = createFont("Arial",24,true);  
  
    // Initialise the population  
    MyPopulation= new Population(70, max_generations, 0.01); // pop size, mutatic  
    generation=0;  
  
    draw();  
}  
  
void draw () // main loop  
{  
    // ...  
}
```

Current best fitness: 15, with a genome of 1001000  
Generation 25  
Current best fitness: 15, with a genome of 1001000  
Generation 26  
Current best fitness: 15, with a genome of 1001000  
Generation 27  
Current best fitness: 15, with a genome of 1001000  
Generation 28

Console Errors

# Next lecture

- Next week: (Remember, *this lecture is next Monday*) - advanced topics in GAs  
~~Assignment Project Exam Help~~
- This week's lab: Knapsack GA (but only move onto this once you have finished your assignment!)  
~~Add WeChat still important, though...~~  
<https://powcoder.com>