

# **UNIVERSITY OF BIRMINGHAM**

**School of Computer Science**

Final Year – BSc Computer Science  
Third Year – MSci Computer Science  
Third Year – MEng Computer Science/Software Engineering  
Third Year – MSci Mathematics & Computer Science  
Final Year – BSc Computer Science with Industrial Year  
Third Year – MSci Computer Science with Industrial Year

**06 28209**

**Nature Inspired Search and Optimisation**

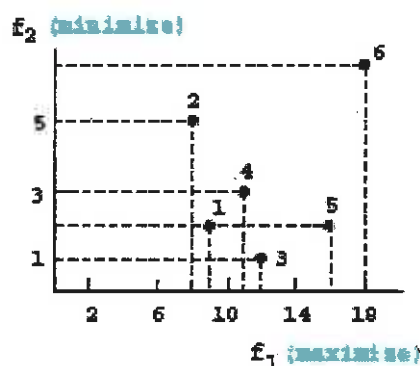
**Summer May/June Examinations 2017**

**Time allowed: 1 hour 30 minutes**

**[Answer ALL Questions]**

Answer the following questions:

1. [Total: 40%]
  - (a) Given  $N$  chromosomes (individuals) in a population and their fitness  $f_1, f_2, \dots, f_N$ , describe the probability of selecting the  $i$ -th chromosome (where  $i \in \{1, \dots, N\}$ ) using the roulette-wheel selection. [4%]
  - (b) Roulette-wheel selection may lead to premature convergence due to the "super-individuals" problem. Explain this problem. [4%]
  - (c) What is bloat in a genetic programming, and how can we manage it in a tree-based representation? [4%]
  - (d) Suppose we want to minimize a real valued fitness function  $f: \mathbb{R} \rightarrow \mathbb{R}$  over the interval  $[-5, 10]$ , of which the subintervals  $[-1, 0]$  and  $[2, 4]$  are infeasible. Draw an example of a fitness function with an associated penalised fitness. [4%]
  - (e) What is the main practical difficulty with the penalty approach and how can the penalty approach be enhanced? [4%]
  - (f) Would it be a good idea in constrained optimisation to simply discard the infeasible individuals from the population? Why or why not? [4%]
  - (g) State the No-Free-Lunch theorem in plain English, and say what implication it has. [4%]
  - (h) What is co-evolutionary learning and how does it differ from evolutionary learning? Do you see any relation between co-evolution and fitness sharing? [4%]
  - (i) What is the difference between the Michigan and the Pitt approach of evolving a classifier system? [4%]
  - (j) The following figure depicts a population of individuals trying to maximize the objective  $f_1$  and to minimize the objective  $f_2$ . Give the first two non-dominated fronts. [4%]



2. [Total: 30%]

The payoff matrix of the N-player iterated prisoner dilemma game can be defined as follows:

		Nr co-operators among the other N-1 players				
		0	1	2	...	N-1
Player A:	C	0	2	4	...	$2(N-1)$
	D	1	3	5	...	$2(N-1)+1$

Players have two possible actions: cooperate (C) or defect (D). Players cannot communicate within a round of the game. The numbers in the table represent the payoff received by player A as a function of his/her the action and the number of cooperators amongst the other participants. All players in an N-player game are treated equally. So the payoff matrix is symmetrical to all players.

Design an evolutionary / co-evolutionary algorithm for learning to play the iterated 4-player prisoner's dilemma game, assuming that players remember the history of the last 3 rounds of the game. Each individual in your population will be a playing strategy, and you try to evolve the best strategy. In particular, the following is required, justifying your design decisions:

- (a) Design the chromosome representation of the strategies.
  - (i) Explain how to encode a strategy as a binary string? [6%]
  - (ii) What is the size of such a chromosome? [6%]
- (b) Design suitable evolutionary operators (crossover, mutations). [6%]
- (c) Design a suitable fitness evaluation function, and a suitable selection scheme [6%]
- (d) Comment on strengths and weaknesses of your design. [6%]

3. [Total 30%]

Diagnosis prediction is an important medical problem. The input data corresponds to a number of medical variables encoding the results of different tests and measurements, and the target is to predict the diagnosis of a patient. However there is usually a complicated relationship between the input variables and the target. A predictor is a system that is able to learn this relationship from examples and based on that can perform the prediction task. Design an evolutionary algorithm to evolve a predictor capable of predicting diagnosis. Explain, discuss and justify all your design decisions.

- (a) Describe in words the predictor that you will use, in terms of inputs, outputs and architecture [6%]
- (b) Design a chromosome representation for the individuals in your population. [6%]
- (c) Design appropriate evolutionary operators to be used, detailing and explaining how and in which order they will be used. [6%]
- (d) How will the fitness be evaluated? [6%]
- (e) What selection schemes will be used? [6%]

**Do not complete the attendance slip, fill in the front of the answer book or turn over the question paper until you are told to do so**

**Important Reminders**

- Coats/outwear should be placed in the designated area.
- Unauthorised materials (e.g. notes or **tippex**) must be placed in the designated area.
- Check that you do not have any unauthorised materials with you (e.g. in your pockets, pencil case).
- Mobile phones and smart watches must be switched off and placed in the designated area or under your desk. They must not be left on your person or in your pockets.
- You are not permitted to use a mobile phone as a clock. If you have difficulty seeing a clock, please alert an Invigilator.
- You are not permitted to have writing on your hand, arm or other body part.
- Check that you do not have writing on your hand, arm or other body part – if you do, you must inform an Invigilator immediately
- Alert an Invigilator immediately if you find any unauthorised item upon you during the examination.

**Any students found with non-permitted items upon their person during the examination, or who fail to comply with Examination rules may be subject to Student Conduct procedures.**