

## EECS 649: PROBLEM SET 4

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### Reading:

- R&N 4.1, including box on page 118; 4.2 as needed for review; 6.1-4

**Total Points: 100**

### Format:

- Use standard sheets of paper (8.5 by 11 inches) before scanning
  - Perform all work neatly. When asked to write a paragraph, it should be typed (e.g., using a computer and LaTeX or Word).
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*The answers to the following two problems should be **typed**:*

### Problem 4.1 [10 points]

[Nilsson] Specify fitness functions for use in evolving agents that

- a. control an elevator,
- b. control stop lights on a city main street.

### Problem 4.2 [10 points]

Give a precise formulation for the following as a constraint satisfaction problem (CSP):

Class scheduling: There is a fixed number of professors and classrooms, a list of classes to be offered, and a list of possible time slots for classes. Each professor has a set of classes that he or she can teach.

In formulating your answer, consider the definition of CSPs at the start of Section 6.1 and specify  $X$ ,  $D$ ,  $C$ .

*This problem requires hand calculation and need **not** be typeset:*

### Problem 4.3 [20 points]

Solve the cryptarithmic problem in Figure 6.2 of R&N by hand, using the strategy of backtracking with forward checking and the MRV and least-constraining-value heuristics.

Record the steps and the reasoning/method behind them.

**(You solve the problem once, using forward checking, making use of the two stated heuristics to pick variables and values, and recording what you used when.)**

Does min-conflicts make sense for this type of problem?

*The following two problems require programming:*

#### **Problem 4.4 [30 points]**

Repeat the one-dimensional optimization experiment from the eHandout of Local Search lecture. (See the bottom page 2 of the [Local Search Handout](#) for that day.) Specifically, maximize

$$F(x) = 4 + 2x + 2 \sin(20x) - 4x^2$$

on the interval  $[0, 1]$  using fitness-proportional selection (aka roulette selection) of individuals (points of the form  $0.01 \cdot k$ ,  $k = 0, \dots, 100$ ) and simple mutation ( $x \pm \epsilon$ , with probability 0.3; copy with probability 0.4;  $x + \epsilon$ , with probability 0.3). You may use  $\epsilon = 0.01$ .

Use at least  $N=10$  individuals in your population. Report  $N$  and comment on your experiments and results. Turn in documented **code**.

**Repeat** the above, but add a crossover operator that is a convex combination of two individuals,  $x$  and  $y$ :  $ax + (1-a)y$ , for  $0 \leq a \leq 1$ .

*Use roulette selection instead of the “if fitness(x)>r” selection in my example. Specifically, choose an individual to be “reproduced” proportional to its fitness. So, if in the current generation, you had  $x_1, \dots, x_{10}$ , the total population fitness would be  $TF = \sum_i F(x_i)$ . Then these would be chosen for “reproduction” in the next generation with probabilities  $F(x_1)/TF, F(x_2)/TF, \dots, F(x_{10})/TF$ .*

*After mutation, individuals should be clipped to remain within the interval  $[0, 1]$ .*

**CROSSOVER IS LIKE THIS** [you may enforce both parents to be different below if you wish]:

*For each individual I want to produce in the next generation:*

*I pick two parents, each using a different “spin” of roulette selection:*

*And combine them using crossover, picking a random  $a$*

#### **Problem 4.5 [30 points]**

Consider the **8-queens Problem** from R&N. Here, you will solve 8-queens using

- Random-restart hill-climbing (RRHC; cf. Section 4.1.1 of R&N)

You will be **minimizing** “fitness,” defined as the number of **non-attacking** pairs of queens (as on the bottom of p. 117 of R&N), which is 28 minus “the number of pairs of queens that are attacking each other, either directly or indirectly” (see note in the middle of p. 112 of R&N regarding intervening pieces). Thus, in this problem, when you find a configuration/state with fitness = 28, you have found a solution.

- a. Implement the RRHC above. Write your algorithm so that it exits as soon as a solution is found, prints the solution (as a string of digits like those depicted in Figure 4.7 of

R&N), and prints the total number of **fitness evaluations** required from the start of the algorithm.

- b. Test your routines enough to convince yourself that they work and that solutions are being found appropriately. **(Do not report on this.)**
- c. You will gather statistics regarding the operation of your algorithms by running each algorithm 100 times (from different random starting positions/populations) and report only the **average** of the number of evaluations until a solution is found. **(You may wish to add a cut-off number of iterations that are not exceeded; in this case, don't include failed searches in your average.)**

Turn in your **code** and a **summary** of your results.

**Note:**

I don't expect you to program this from scratch. This problem is **much, much easier** if you look at or use the code that is already available:

- I have placed some (non-optimized, no-guarantees) C++ code that I used for a more extensive exploration of local search algorithms for the 8-queens problem at [8queens.ipynb](#). **It also includes a translation to Python of the main routines.**
- R&N's On-Line Code Repository contains code for the n-queens problem written in a variety of languages. See the linked [github repository](#), which includes Python, Java, ...

**Further Notes:**

- PS5 will also use the 8-queens problem in an effort to amortize your time and effort
- Also, there is a linked [EXTRA CREDIT OPPORTUNITY](#) involving the 8-queens problem