## Introduction to Stochastic Processes and Computer Simulation, CSc 85200

## **Homework Assignment 4**

**Problem 1** Consider a M/GI/1 queue with Poisson arrivals of rate  $\lambda$  and iid service times  $\{S_i\}$  with distribution  $\Gamma(3, 0.25)$ . The goal is to estimate the stationary average queue length  $\theta$ . For each simulation model, namely the discrete-event based model and the Petri-net model, do the following. [*Hint:* You may re-use your code from Series 3. If you write your code carefully you should be able to just change a subroutine and use common modules for both models].

- (a) Let  $\alpha = 0.05$ . Use an adaptive algorithm to stop the simulation so that the approximate confidence interval has precision  $\epsilon = 0.1$ . Assume that you do not know the mean and variance of the service distribution (that is, your program could run by reading consecutive service times from a file with historical data, for example). Explain your choice of the algorithm (independent runs, batch means, discarding of "warm-up" period, etc).
- (b) Show that the total number of iterations in your simulation model using the stopping rule that you have defined is a random stopping time with respect to the simulation process.
- (c) Perform 20 independent simulation runs to estimate the coverage probability for  $\theta$ . Discuss your results.
- (d) Discuss the results of the two different approaches.

**Problem 2** Explain how to apply each of the following methods for variance reduction for the problem above when implementing the Petri net model for simulation:

- (a) Antithetic random variables.
- (b) Control variable (what variable do you propose to use for the control?)
- (c) Perform the simulations with the added methods using the same stopping criterion and record the CPU times for the 20 replications. Compare your results with those of the previous problem.

**Problem 3** There are N individuals in a population, some of whom have a certain infection that spreads as follows. Contacts between two members of this population occur in accordance with a Poisson process of rate  $\lambda$ . When a contact occurs, it is equally likely to involve any of the  $\binom{N}{2}$  pairs of indivudulas. If a contact involves an infected and a healthy individual, then with probability p the non-infected one becomes infected. Once infected, an individual remains infected throughout. we assume no deaths, and no spontaneous infection. Let X(t) denote the number of infected individuals.

- (a) Show that  $\{X(t), t \ge 0\}$  is a continuous time Markov Chain (CTMC).
- (b) Specify its type (is it a Poisson process?)
- (c) Starting with a single infected individual, what is the expected time until all members of the population are infected?

**Problem 4** You have decided to do consultation for modeling, simulation and optimization. You offer various research services: modeling, statistical analysis, optimization, software development, etc. There are N such research stages and they always follow a specific order: research of type n is always followed by that of type n - 1, for  $N \ge n > 1$ . The time (in hours) required to complete stage n follows a distribution  $F_n$  of mean  $\mu_n$ . Potential clients arrive according to a Poisson process of rate  $\lambda$ , and you take the job only if you are free at the time of arrival of the client. If you are already working on a problem then you do not take new contracts. Each problem starts at stage n with probability  $p_n$  and ends at stage 1, following all intermediate stages.

- (a) Under what conditions on  $\{F_n\}$  is X(t) a CTMC? Give the rates  $v_i$  and transition kernel  $P_{ij}$ .
- (b) Suppose that the distributions  $F_n$ , n = 1, ..., N are not memoryless. You assume that you will charge c dollars per hour of work. Specify the regeneration points of the process and determine the long term rate of profit.
- (c) In order to price your services correctly, let us assume that clients are discouraged if c is too big. Specifically, assume that the probability that clients accept your conditions is given by  $P_c = (K c)/K, 0 \le c < K$ . If  $c \ge K$  then  $P_c = 0$  (no client will hire you). Use  $K = 2, \lambda = 2$ , and  $M \stackrel{\text{def}}{=} \sum_n p_n (\sum_{i=1}^n \mu_i^{-1} = 1)$ . Determine the new long term profit rate R(c) and find the optimal value of c.

**Problem 5** Variance reduction via conditioning and via IS: to come.