## CSC 284/484 - homework 2 (Monte Carlo)

http://www.cs.rochester.edu/~stefanko/Teaching/16CS484

Students that take the course as 484 are required to do **both** 284/484 and 484 parts of the homework. Students that take the course as 284 are only required to do 284/484 part of the homework (of course you are welcome to solve/turn-in the 484 part as well).

# 1 284/484 homework - solve and turn in

#### 1.1 Theoretical part

**Exercise 1.1** (due 2/11/2016) Random variable X has squared coefficient of variation A (that is,  $V[X]/E[X]^2 = A$ ). Random variable Y has squared coefficient of variation B. Let  $X_1, \ldots, X_n, Y_1, \ldots, Y_m$  be independent with  $X_i$ 's having the same distribution as X and  $Y_j$ 's having the same distribution as Y. Let Z

$$Z = \frac{X_1 + \dots + X_n}{n} \cdot \frac{Y_1 + \dots + Y_m}{m}$$

What is E[Z]? What is the squared coefficient of variation of Z?

**Exercise 1.2** (due 2/11/2016) Let K be a real number. We have two unknown parameters a, b where  $0 \le b - a \le K$ . We are getting samples from the following distribution: Uniform[a, b]. We want to output absolute error estimates  $\hat{a}, \hat{b}$  of a, b, that is,  $\hat{a}$  and  $\hat{b}$  should satisfy

$$P(|a - \hat{a}| \le \varepsilon \land |b - \hat{b}| \le \varepsilon) \ge 1 - \delta.$$

Design a procedure for the estimation that uses as few samples as possible (asymptotically). Prove that your procedure is correct. Clearly state the (asymptotic) number of samples used by your procedure.

#### 1.2 Applied part

**Exercise 1.3** (due 2/11/2016) Implement the algorithm that approximately counts the number of satisfying assignments of a DNF formula. Your implementation should read the input from stdin. The input is:

- a DNF F given in the following format: the first line contains two numbers n (the number of variables) and m (the number of (conjunctive) clauses); the next m lines contain the clauses of the formula F: a number  $i \in \{1, \ldots, n\}$  stands for literal  $x_i$ , a number  $-i \in \{1, \ldots, n\}$  stands for literal  $\neg x_i$ .
- the next line contains precision  $\varepsilon > 0$ ,
- the final line contains error probability  $\delta \in (0, 1)$ .

The output of your algorithm should be a single number X—your estimate of the number of satisfying assignments of the input formula (the number should be output to stdout). Your algorithm should guarantee that  $P(X \in [(1 - \varepsilon)C, (1 + \varepsilon)C]) \ge 1 - \delta$  where C is the number of satisfying assignments of F.

Example input:

3 2 1 2 3 -1 -2 -3 0.1 0.01

The DNF formula encoded is  $F = (x_1 \land x_2 \land x_3) \lor (\neg x_1 \land \neg x_2 \land \neg x_3)$  (the formula has 2 satisfying assignments).

### $2 \quad \underline{484 \text{ homework}}$ - solve and turn in

#### 2.1 Theoretical part

**Exercise 2.1** (due 2/11/2016) We have two unknown parameters a, b, a < b. We are getting samples from the following distribution: Uniform[a, b]. We want to output a relative error estimate  $\hat{c}$  of c := b - a, that is,  $\hat{c}$  should satisfy

$$P(|b - a - \hat{c}| \le \varepsilon |b - a|) \ge 1 - \delta.$$

Design a procedure for the estimation that uses as few samples as possible (asymptotically). Prove that your procedure is correct. Clearly state the (asymptotic) number of samples used by your procedure.

**Exercise 2.2** (due 2/11/2016) We have one unknown parameter *a*. We are getting samples from the following distribution: Cauchy[*a*, 1]. The probability density function for the distribution is

$$f(x) = \frac{1}{\pi(1 + (x - a)^2)}$$

We want to output an absolute error estimate  $\hat{a}$  of a, that is,  $\hat{a}$  should satisfy

$$P(|a - \hat{a}| \le \varepsilon) \ge 1 - \delta.$$

Design a procedure for the estimation that uses as few samples as possible (asymptotically). Prove that your procedure is correct. Clearly state the (asymptotic) number of samples used by your procedure.

#### 2.2 Applied part

**Exercise 2.3** (due 2/11/2016) Implement the determinant estimator for the permanent of zeroone matrices. Your implementation should read the input from stdin. The input is:

- an  $n \times n$  matrix A given in the following format: the first line contains a numbers n (the dimensions of the matrix); each of the next n lines contain n numbers from  $\{0, 1\}$ .
- the next line contains precision  $\varepsilon > 0$ ,
- the final line contains error probability  $\delta \in (0, 1)$ .

The output of your algorithm should be a single number X—your estimate of the permanent of the input matrix (the number should be output to stdout). Your algorithm should guarantee that  $P(X \in [(1 - \varepsilon)\operatorname{per}(A), (1 + \varepsilon)\operatorname{per}(A)]) \ge 1 - \delta$ .

Example input:

0.01

(Permanent of the input matrix above is 6.)