CSE 632: Analysis of Algorithms II: Randomized Algorithms

Fall 2019

## Homework 1

Lecturer: Shi Li

Deadline: Sep 26, 2019

**Problem 1 (10 points)** Another way to decrease the error probability of Freivalds' matrix multiplication verification algorithm is to choose the vector r randomly from the set  $\{0, 1, 2, 3, \dots, M-1\}^n$  and check if ABr = Cr. Prove that the error probability of this modification of Freivalds' algorithm is at most 1/M.

**Problem 2 (15 points)** Consider the following modification of the randomized algorithm for selecting the *i*-th smallest element from an array A of *distinct* numbers. In this modification, we repeatedly select the pivot x until we find a good one.

Algorithm 1 randomized\_selection(A, i)1: if |A| = 1 then return A[1]2: repeat  $x \leftarrow$  a random number in A 3: 4:  $B \leftarrow \text{array of numbers in } A$  that are smaller than x $C \leftarrow \text{array of numbers in } A$  that are bigger than x 5:6: until |B| < 3|A|/4 and |C| < 3|A|/47: if  $i \leq |B|$  then **return** randomized\_selection(B, i)8: 9: else if i = |B| + 1 then return x10:11: else 12:**return** randomized\_selection(C, i - |B| - 1)

Prove that this variant also has expected running time O(n), where n = |A|.

**Problem 3 (9 points)** For each of the following three variables X,

- (a) give all the values X can take and the probability that X equals each of these values,
- (b) compute  $\mathbb{E}[X]$ , and
- (c) compute  $\operatorname{Var}[X]$ .

Variable (i): Toss a unbiased coin 3 times and let X be the number of times we get head-up.

- Variable (ii): Throw a 4-sided dice (with values 1, 2, 3, 4 on the 4 sides) twice and let X be the product of the two values we obtained.
- Variable (iii): Suppose there is a puzzle and there are 3 programs which we can run to try solving the puzzle. Program A takes 1 minute to solve the puzzle and program B takes 2 minutes to solve the puzzle. Program C can not solve the puzzle and it will report failure in 1 minute. Suppose we run the 3 programs sequentially using a uniformly

random order of the 3 programs (that is, with probability 1/6 each, we use the order ABC, ACB, BAC, BCA, CAB, CBA). We stop when a program solved the puzzle. Let X be the total time (in minutes) we spent on running the programs. For example, suppose the order we used is CAB. We run C and fail, then we run B and succeed and then X is 2.

**Problem 4 (12 points)** Remember in the course you learned the geometric distribution: we keep tossing a biased coin with head-up probability p until we see a head-up. Let X be the total number of coin tosses we have. Then X is the geometric distribution with parameter p. We showed that  $\mathbb{E}[X] = 1/p$  and  $\operatorname{Var}[X] = (1-p)/p^2$ . Now suppose we stop the process when we see 10 head-up's and let Y be the number of coin tosses we have in the process. What is  $\mathbb{E}[Y]$  and  $\operatorname{Var}[Y]$ ? You need to give proofs for your answers.

**Problem 5 (14 points)** Let X be a random variable from a geometric distribution with parameter p. Prove that the following two events E and F are independent:

- event  $E: X \ge 50$ ,
- event F: X is an integer multiple of 7.