

Homework is due by **7am of Sep 12**. Send by email to both “regev” (under the cs.nyu.edu domain) and “avt237@nyu.edu” with subject line “CSCI-GA 3210 Homework 0” and name the attachment “YOUR NAME HERE HW0.tex/pdf”, and please also bring a printed copy to class. Start early!

**Instructions.** Solutions must be typeset in L<sup>A</sup>T<sub>E</sub>X (a template for this homework is available on the course web page). Your work will be graded on *correctness*, *clarity*, and *conciseness*. You should only submit work that you believe to be correct; if you cannot solve a problem completely, you will get significantly more partial credit if you clearly identify the gap(s) in your solution. It is good practice to start any long solution with an informal (but accurate) “proof summary” that describes the main idea.

You are expected to read all the hints either before or after submission, but before the next class.

You may collaborate with others on this problem set and consult external sources. However, you must *write your own solutions*. You must also *list your collaborators/sources* for each problem.

1. Send email to Oded (regev at cims) with subject CSCI-GA 3210 student containing (1) a few sentences about yourself and your background (including your department, graduate program, how long in program), and (2) your comfort level with the following: mathematical proofs, elementary probability theory, big-O notation and analysis of algorithms, Turing machines, and P, BPP, NP, and NP-completeness. Please also mention any courses you’ve taken covering these topics.
2. (*Working with negligible functions.*<sup>1</sup>) Recall that a non-negative function  $\nu : \mathbb{N} \rightarrow \mathbb{R}$  is *negligible* if it decreases faster than the inverse of any polynomial (otherwise, we say that  $\nu$  is *non-negligible*). More precisely,  $\nu(n) = o(n^{-c})$  for every fixed constant  $c > 0$ , or equivalently,  $\lim_{n \rightarrow \infty} \nu(n) \cdot n^c = 0$ .

State whether each of the following functions is negligible or non-negligible, and give a brief justification. In the following,  $\text{negl}(n)$  denotes some arbitrary negligible function, and  $\text{poly}(n)$  denotes some arbitrary polynomial in  $n$ . (If you are not comfortable with these notion, read Section 4.2 of Lecture 2 in Peikert’s notes)

- (a) (1 point)  $\nu(n) = 1/2^{100 \log n}$ .
- (b) (1 point)  $\nu(n) = n^{-\log \log \log n}$ . (Compare with the previous item for “reasonable” values of  $n$ .)
- (c) (1 point)  $\nu(n) = \text{poly}(n) \cdot \text{negl}(n)$ . (State whether  $\nu$  is *always* negligible, or not necessarily.)
- (d) (1 point)  $\nu(n) = (\text{negl}(n))^{1/\text{poly}(n)}$ . (Same instructions as previous item.)
- (e) (1 point)

$$\nu(n) = \begin{cases} 2^{-n} & \text{if } n \text{ is composite} \\ 100^{-100} & \text{if } n \text{ is prime.} \end{cases}$$

3. (*Statistical distance.*) Recall that given two distributions over a (finite) set  $\Omega$ , their statistical distance (also known as variational or  $L_1$  distance) is defined as

$$\Delta(X, Y) := \frac{1}{2} \sum_{\omega \in \Omega} |X(\omega) - Y(\omega)|.$$

- (a) (3 points) Show that  $\Delta$  defines a metric (see here for the definition).

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<sup>1</sup>Based on a question from Peikert’s class

- (b) (3 points) Show that the following is an equivalent definition:

$$\Delta(X, Y) := \sup_{A \subseteq \Omega} |X(A) - Y(A)|,$$

where  $X(A)$  denotes the probability of  $X$  to be in  $A$ , and similarly for  $Y(A)$ . Give an “operational” interpretation to this definition (i.e., in terms of an algorithm trying to distinguish  $X$  and  $Y$ ).

- (c) (3 points) Let  $D_0$  and  $D_1$  be two distributions over the same support  $\Omega$ . Suppose that we play the following game with an algorithm  $\mathcal{A}$ . First, we pick at random a bit  $b \leftarrow \{0, 1\}$  and then we pick  $x \leftarrow D_b$  and we give  $x$  to  $\mathcal{A}$ . Finally,  $\mathcal{A}$  returns a bit  $\mathcal{A}(x)$ . It wins if the bit returned is equal to  $b$ . Show that the highest success probability in this game is exactly  $\frac{1}{2} + \frac{1}{2}\Delta(D_0, D_1)$ .
4. (6 points) (Pairwise independence) Assume that  $r_1, \dots, r_t$  are independent uniform strings in  $\{0, 1\}^n$ . Show that the collection of all  $2^t - 1$  nontrivial XORs,  $\{\bigoplus_{i \in S} r_i\}_{\emptyset \neq S \subseteq [t]}$  is pairwise independent, i.e., any two of them are jointly distributed like an independent uniform pair of strings in  $\{0, 1\}^n$ .
5. (*Large deviation bounds.*) Assume that  $X_1, \dots, X_n$  are independent identically distributed (i.i.d.) random variables, each taking 1 with probability  $p$  and 0 with probability  $1 - p$ . Recall that Chernoff’s bound says that for all  $\varepsilon > 0$ ,

$$\Pr \left[ \left| \frac{1}{n} \sum_i X_i - p \right| > \varepsilon \right] \leq 2e^{-2n\varepsilon^2}.$$

If you are rusty on Chernoff’s bound, read about it, e.g., here or search Google; there are lots of forms of the bound, the above being the most convenient for our applications.

- (a) (2 points) How large should  $n$  be if we want the average of the  $X_i$  to be within  $\pm\varepsilon$  of  $p$  with probability at least  $1 - \delta$ ? (asymptotic expression for  $n$  is enough)
- (b) (3 points) Imagine we used Chebyshev’s bound instead of Chernoff’s, and if you wish, assume for simplicity that  $p = 1/2$ . What bound on  $n$  would you get then? Do you see any advantage of Chebyshev’s bound over Chernoff’s?
6. (*Error-correcting codes (optional, no credit.)*) This is a bit off topic, but will give you an idea of the kind of math we use in this course. It will also give you a glimpse to an immensely important topic that also dates back to Shannon’s seminal work. These ideas are used in pretty much all digital communication protocols: cell phones, Internet, satellites, etc.
- (a) Assume we choose  $2^{n/20}$  strings from the set  $\{0, 1\}^n$  uniformly at random. Show that with positive probability (in fact, high probability) the Hamming distance (i.e., number of different coordinates) between *any* two strings in the set is more than  $n/4$ . I need a hint! (ID 84542)
- (b) Show how Alice can communicate to Bob a message of  $k$  bits by sending only  $n = 20k$  bits in such a way that Bob can recover the message even if an adversary flips up to  $n/8$  bits of the communication. Would simply repeating the message 20 times be good enough?