

# IT 584 Approximation Algorithms

Tutorial on Markov, Chebysev and Chernoff bounds

<sup>1</sup> A random variable  $X$  is always strictly larger than  $-100$ . You know that  $E[X] = -60$ . Give the best upper bound you can on  $P(X \geq -20)$ .

---

<sup>1</sup>I have taken the liberty to use many of the questions from the course CS 328 2020 at IIT Gandhinagar offered by Prof. Anirban Dasgupta

A post office handles, on average, 10000 letters a day.

- ▶ a) Using Markov's inequality, what can be said about the probability that it will handle at least 15000 letters tomorrow ?
- ▶ b) Suppose now that the variance  $\sigma^2$  in the number of letters per day is 2000. Using Chebyshev's inequality what can be said about the probability that this post office handles between 8000 and 12000 letters tomorrow?
- ▶ c) Using Chebyshev's inequality how can we bound the probability that it will handle at least 15000 letters tomorrow? How does it compare with the bound in (a).

A casino is testing a new class of simple slot machines. Each game, the player puts in \$1, and the slot machine is supposed to return either \$3 to the player with probability  $4/25$ , \$100 with probability  $1/200$ , or nothing with all remaining probability. Each game is supposed to be independent of other games. The casino has been surprised to find in testing that the machines have lost \$10,000 over the first million games. Derive a Chernoff bound for the probability of this event.

We plan to conduct an opinion poll to find out the percentage of people in a community who want its president impeached. Assume that every person answers either yes or no. If the actual fraction of people who want the president impeached is  $p$ , we want to find an estimate  $X$  of  $p$  such that  $Pr(|X - p| \leq \epsilon p) > 1 - \delta$  for a given  $\epsilon$  and  $\delta$ , with  $0 < \epsilon, \delta < 1$ .

We query  $N$  people chosen independently and uniformly at random from the community and output the fraction of them who want the president impeached. How large should  $N$  be for our result to be a suitable estimator of  $p$ ? Use Chernoff bounds, and express  $N$  in terms of  $p$ ,  $\epsilon$ , and  $\delta$ . Calculate the value of  $N$  from your bound if  $\epsilon = 0.1$  and  $\delta = 0.05$  and if you know that  $p$  is between 0.2 and 0.8.

We have  $n$  i.i.d. Bernoulli ( $p$ ) random variables. Let  $A$  be the average of these random variables. The following plots are on log-scale (in y-axis) and show various bounds and approximations for the  $Pr[A > 1.1E[A]]$  as a function of  $n$  (depicted in linear scale in x-axis). The scatterpoints represent the actual probability of the deviation. In this set of plots,  $p = 0.4$ . Label which one corresponds to Markov's Inequality, to Chebyshev's Inequality, and to a Chernoff Bound.

