## MATH 505a

Ideas for solutions.

**1.** (a) There are n = 100 balls, labeled 1 to n, and these are thrown into n boxes, also labeled 1 to n; all  $n^n$  outcomes are equally likely. Whenever ball i lands in box j, and  $|i-j| \leq 1$ , a point is scored, so the total score, call it X, can take on any value from 0 to n. Note: ball 1 in box n scores nothing, and ball n in box 1 scores nothing. Compute exactly, and simplify, as either an expression in n, or a decimal: E(X) and Var(X).

(b) Pick the closest approximation: in part (a), P(X = 0) is close to 1, 1/3, 1/20, 1/100. You may reason informally, but you must describe your reasoning, which should involve the approximate distribution of X.

(c) Change the story in (a) to: there are n = 100 cards, numbered 1 to n, and they are placed in slots 1 to n around a circle at random, so that all n! outcomes are equally likely. Whenever card i is placed in position i or i + 1, a point is scored, so the total score, call it Y, can take on any value from 0 to n. Here for card n, since the cards are in a circle, "position n+1" should be interpreted as position 1. Compute exactly, and simplify, as either an expression in n, or a decimal: E(Y) and Var(Y).

In part (a), each ball has probability 1/n to land in a given box, and balls land independently of one another; in particular, several balls can land in the same box. There are two ways to score in boxes 1 and n, and three ways to score in all other boxes. Thus, we have the sum of two Bernoulli 2/n and (n-2) Bernoulli 3/n, all independent. The mean is then 2(2/n)+(n-2)(3/n)=3-(2/n). The variance is  $2(2/n)(1-(2/n))+(n-2)(3/n)(1-(3/n))=(3n^2-11n+10)/n^2$ . With mean approximately equal to three, the Poisson approximation gives the answer in (b) as  $e^{-3} \approx 1/20$ .

In part (c), each card has exactly two ways to score, and the same probability 1/n to land in any particular slot, so the mean score is exactly two. To compute the variance, write  $X_i$  for the indicator that ball *i* scores, with  $p := EX_i = 2/n$ 

For the variance covariance expansion,  $\sum cov(X_i, X_j)$  has

a) n terms where i = j, each term contributes  $cov = p - p^2$ .

b) 2n terms where i, j are adjacent. There are 3 ways for both to score, so each term contributes  $cov = 3/(n(n-1)) - p^2$ .

c) n(n-3) terms where i, j are distinct and not adjacent. There are 4 ways for both to score, so each term contributes  $cov = 4/(n(n-1)) - p^2$ .

Adding up and simplifying leads to the final answer  $2 - \frac{2}{n-1}$ .

**2.** (a) A coin comes up heads with probability  $p \in [0,1]$ ; it is tossed independently n times, and X is the total number of heads. Simplify the generating function

$$G(s) = E(s^X),$$

and show how derivatives of G can be used to calculate E(X) and  $E(X^2)$ .

(b) Random variables  $U, U_1, U_2, \ldots, U_n$  are independent, and uniformly distributed in [0,1]. Let

$$Y = \sum_{1}^{n} \mathbb{1}_{\{U_i < U\}}$$

be the sum of indicators, counting how many of the  $U_i$  are less than U. Simplify the generating function

$$H(s) = E(s^Y),$$

and then simplify the ratio, P(Y = 2)/P(Y = 1). HINT: conditionally on U = p, this Y is distributed as the X in part (a).

For (a), the answer is straightforward:

$$G(s) = G(s; p) = \sum_{k=0}^{n} \binom{n}{k} (sp)^{k} (1-p)^{n-k} = \left(1 + (s-1)p\right)^{n}.$$

The general definition of the (probability) generating function  $G_X$  of an integer-valued random variable X implies

$$E(X) = G'_X(1), \ E(X^2 - X) = G''_X(1).$$

After conditioning on U = p and integrating, we get the answer to part (b):

$$H(s) = \int_0^1 G(s; p) dp = \frac{s^{n+1} - 1}{(n+1)(s-1)} = \frac{1 + s + \dots + s^n}{n+1}.$$

The answer shows that Y is uniform on  $\{0, 1, ..., n\}$ , and, in particular,

$$\frac{P(Y=2)}{P(Y=1)} = 1$$

- **3.** Let  $X_1, \ldots, X_n, Y_1, \ldots, Y_m$  be iid uniform on (0, 1).
- (a) Compute the probability density function of  $\max(Y_1, \ldots, Y_m)$ .
- (b) Compute the probability density function of

$$\frac{\max(X_1,\ldots,X_n)}{\max(Y_1,\ldots,Y_m)}.$$

The distribution function of the max of m iid uniforms is  $x^m$ ,  $x \in (0, 1)$  (all m of them must be less than x), and the density is  $mx^{m-1}$ .

The answer for (b) is  $cu^{n-1}$ , 0 < u < 1 and  $c/u^{m+1}$ , u > 1, where c = mn/(m+n).

The solution for (b) is straightforward from the formula for the density of the ratio of two independent random variables; a complete solution should include a picture, such as the image of the unit square under the corresponding transformation.