

## Homework 3

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Due: 2023/10/29 10:59pm

1. Please reinterpret the following story from the Bayesian perspective.

狼来了：从前有个放羊娃，每天都把羊群带到山上去吃草，山里有狼出没。第一天，放羊娃觉得无聊，想要作弄山下耕作的村民。他朝着山下大喊“狼来了！狼来了”，村民们信以为真，冲上山来准备帮助他，发现被欺骗了，大家很生气。第二天，放羊娃故技重施，村民们虽然有点迟疑，但还是冲上山来准备打狼，结果又一次发现被欺骗了，大家非常生气。第三天，狼真的来了，此时放羊娃慌了，哭着向山下大喊“狼来了！狼来了！”，请求村民的帮助。但这一次村民们认为他又在撒谎，无人相信他。最后他所有的羊都被狼吃掉了。



2. A fair die is rolled repeatedly, and a running total is kept (which is, at each time, the total of all the rolls up until that time). Let  $p_n$  be the probability that the running total is ever exactly  $n$  (assume the die will always be rolled enough times so that the running total will eventually exceed  $n$ , but it may or may not ever equal  $n$ ).
- Write down a recursive equation for  $p_n$  (relating  $p_n$  to earlier terms  $p_k$  in a simple way). Your equation should be true for all positive integers  $n$ , so give a definition of  $p_0$  and  $p_k$  for  $k < 0$  so that the recursive equation is true for small values of  $n$ .
  - Find  $p_7$ .
  - Give an intuitive explanation for the fact that  $p_n \rightarrow 1/3.5 = 2/7$  as  $n \rightarrow \infty$ .
3. A sequence of  $n \geq 1$  independent trials is performed, where each trial ends in “success” or “failure” (but not both). Let  $p_i$  be the probability of success in the  $i^{\text{th}}$  trial,  $q_i = 1 - p_i$ , and  $b_i = q_i - 1/2$ , for  $i = 1, 2, \dots, n$ . Let  $A_n$  be the event that the number of successful trials is even.
- Show that for  $n = 2$ ,  $P(A_2) = 1/2 + 2b_1b_2$ .

(b) Show by induction that

$$P(A_n) = 1/2 + 2^{n-1}b_1b_2 \dots b_n$$

(This result is very useful in cryptography. Also, note that it implies that if  $n$  coins are flipped, then the probability of an even number of Heads is  $1/2$  if and only if at least one of the coins is fair.) *Hint*: Group some trials into a super-trial.

(c) Check directly that the result of (b) is true in the following simple cases:  $p_i = 1/2$  for some  $i$ ;  $p_i = 0$  for all  $i$ ;  $p_i = 1$  for all  $i$ .

4. A message is sent over a noisy channel. The message is a sequence  $x_1, x_2, \dots, x_n$  of  $n$  bits ( $x_i \in \{0, 1\}$ ). Since the channel is noisy, there is a chance that any bit might be corrupted, resulting in an error (a 0 becomes a 1 or vice versa). Assume that the error events are independent. Let  $p$  be the probability that an individual bit has an error ( $0 < p < 1/2$ ). Let  $y_1, y_2, \dots, y_n$  be the received message (so  $y_i = x_i$  if there is no error in that bit, but  $y_i = 1 - x_i$  if there is an error there).

To help detect errors, the  $n$ th bit is reserved for a parity check:  $x_n$  is defined to be 0 if  $x_1 + x_2 + \dots + x_{n-1}$  is even, and 1 if  $x_1 + x_2 + \dots + x_{n-1}$  is odd. When the message is received, the recipient checks whether  $y_n$  has the same parity as  $y_1 + y_2 + \dots + y_{n-1}$ . If the parity is wrong, the recipient knows that at least one error occurred; otherwise, the recipient assumes that there were no errors.

- (a) For  $n = 5, p = 0.1$ , what is the probability that the received message has errors which go undetected?
  - (b) For general  $n$  and  $p$ , write down an expression (as a sum) for the probability that the received message has errors which go undetected.
  - (c) Give a simplified expression, not involving a sum of a large number of terms, for the probability that the received message has errors which go undetected.
5. For  $x$  and  $y$  binary digits (0 or 1), let  $x \oplus y$  be 0 if  $x = y$  and 1 if  $x \neq y$  (this operation is called exclusive or (often abbreviated to XOR), or addition mod 2).

- (a) Let  $X \sim \text{Bern}(p)$  and  $Y \sim \text{Bern}(1/2)$ , independently. What is the distribution of  $X \oplus Y$ ?
- (b) With notation as in sub-problem (a), is  $X \oplus Y$  independent of  $X$ ? Is  $X \oplus Y$  independent of  $Y$ ? Be sure to consider both the case  $p = 1/2$  and the case  $p \neq 1/2$ .
- (c) Let  $X_1, \dots, X_n$  be i.i.d. (i.e., independent and identically distributed)  $\text{Bern}(1/2)$  R.V.s. For each nonempty subset  $J$  of  $\{1, 2, \dots, n\}$ , let

$$Y_J = \bigoplus_{j \in J} X_j.$$

Show that  $Y_J \sim \text{Bern}(1/2)$  and that these  $2^n - 1$  R.V.s are pairwise independent, but not independent.

6. **(Optional Challenging Problem)** By LOTP for problems with recursive structure, we generate many difference equations. To solve the difference equation in the form of

$$f_{i+1} = b \cdot f_i + a \cdot f_{i-1}, i \geq 1.$$

where  $a$  and  $b$  are constants, we turn to the so-called characteristic equation:

$$x^2 = bx + a.$$

If such equation has two distinct roots  $r_1$  and  $r_2$ , then the general form of  $f_i$  is

$$f_i = c \cdot r_1^i + d \cdot r_2^i,$$

If there is only one distinct root  $r$ , then the general form of  $f_i$  is

$$f_i = c \cdot r^i + d \cdot i \cdot r^i.$$

Show the mathematical principle behind the method of characteristic equation.