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# Mini-Quiz 13 1. What is your name? Solution. Sir Galahad of Camelot. \_\_\_\_\_ 2. What is your favorite color? Solution. Blue. No yel– Auuuuuuugh! Suppose you gamble at a roulette wheel with an equal number of red and black slots. 3. If you bet \$1000 on red the first spin and double your bet on each successive spin. What is your expected winnings after any finite number of spins? Solution. \$0. \_\_\_\_\_ 4. If you bet on red until the first time you win, how much do you expect to win? Solution. \$1000. \_\_\_\_\_ Why wouldn't you try this strategy? Solution. You expect to spend an infinite stake before you win.

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# **Tutorial 13 Problems**

**Problem 1** Kyle is playing his favorite computer game: X-Files Adventures. The game begins with Mulder in the main hallway of a space ship searching for clues to the Truth. The hallway has 5 doors. One door exits the space ship. Another door leads back to the main hallway after a journey that passes through one intermediate room. A third door leads back to the main hallway after a journey that passes through two intermediate rooms. A fourth door leads back to the main hallway after a journey that passes through two intermediate rooms. The fifth door leads directly back to the main hallway. What is behind each door is permuted at random using a uniform distribution each time Mulder returns to the main hallway.

(a) How many times can Mulder expect to be in the main hallway before he leaves the ship?

## Solution.

Let the random variable R be the number of times Mulder selects a door before he selects the exit. We need to find Ex(R). This is just a mean-time-to-failure style calculation.  $\text{Ex}(R) = \sum_{i=0}^{\infty} \Pr(R > i) = \frac{1}{p} = 5$  Since Mulder expects to be in the main hallway each time he selects a door, the desired value is 5.

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(b) Any time Mulder enters a room (not the hallway), there is an even chance that he will find a new clue (independent of whether he found a clue in any previous time he may have entered this room).

Let J be the number of journeys Mulder takes before leaving the ship. Let the random variable  $C_i$  be the number of clues Mulder finds on his *i*th journey around the ship. If i > J, we define  $C_i = 0$ .

Let the random variable C the number of clues Mulder would find on any trip through a uniformly chosen, non-exit door. Argue that

$$\Pr(C_i = x \mid J \ge i) = \Pr(C = x)$$

for all  $i \ge 1$  and all x in the range of C.

## Solution.

If  $J \ge i$  then Mulder selects a nonexit door on the *i*th try. In that case,  $C_i$  and C have the same distribution. Thus,  $\Pr(C_i = x) = \Pr(C = x)$ .

### (c) How many clues should Mulder expect to find before he exits the ship?

#### Solution.

We want to compute  $\text{Ex}(C_1 + C_2 + \cdots + C_J)$ . In the previous part we have shown that the variables  $C, C_i$ , and J have the properties necessary for the application of Wald's Theorem. Therefore we know that

$$\operatorname{Ex}(C_1 + C_2 + \dots + C_J) = \operatorname{Ex}(C_1) \cdot \operatorname{Ex}(J).$$

Since the last door Mulder selects is always the exit, J = R - 1 (where R is as in the previous part). Thus, the expected number of journeys, Ex(J) = 4.

To find  $\text{Ex}(C_1)$ , the expected number of clues in the first journey, consider four equally likely cases. Case  $i, 0 \le i \le 3$  corresponds to a journey with i intermediate rooms.

By linearity of expectation, the expected number of clues found during the journey is

$$Ex(C_1) = \sum_{i=0}^{3} Ex(C_{1i})$$

where  $C_{1i}$  is the expected number of clues found during a journey through *i* intermediate rooms.

Again we can use linearity of expectations again to decompose  $C_{1i}$  into *i* individual rooms where Mulder can expect to find 1/2 a clue. So on any journey Mulder expects to find  $\sum_{i=0}^{3} i/2 \cdot 1/4 = 3/4$  clues. Therefore, Mulder expects to find 3 clues before he exits the ship.

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**Problem 2** Psychological diagnosis of sociopaths is notoriously unreliable. For example, a random psychologist is as likely to diagnose a normal patient as sociopathic as he is to recognize that the patient is normal. A random psychologist is actually somewhat *less* likely to correctly diagnose a real sociopath than not—sociopaths are really good liars. Suppose the probability of an errant diagnosis by a random psychologist is known.

In these circumstances it might seem there was no reliable way to diagnose sociopaths, but in theory there is a way—if we have a large enough population of psychologists who reach their judgments independently.

(a) Given a set of independent diagnoses of a patient by n randomly chosen psychologists, give a reliable function to decide if a patient is a sociopath.

#### Solution.

Let  $p_{fn} > 1/2$  be the probability of a random psychologist diagnosing a sociopath as normal (false negative). Let  $p_{fp} = 1/2$  be the probability of a random psychologist diagnosing normal patient as a sociopath (false positive). (Similarly, define the probability of a true

negative diagnosis to be  $p_{tn} = 1 - p_{fp} = 1/2$  and the probability of a true positive diagnosis to be  $p_{tp} = 1 - p_{fn} < 1/2$ .)

After *n* independent trials, we will have *s* "sociopath" diagnoses. Compute the fraction s/n such diagnoses. Decide 1 (the patient is a sociopath) if s/n is closer to  $p_{tp}$  than to  $p_{fp}$ . Decide 0 otherwise. In other words, let the "decision value"  $d = \frac{p_{tp}+p_{fp}}{2}$ . Decide 1 iff s/n < d. Note that  $p_{tp} < d < 1/2 = p_{fp}$  so we decide the patient is a sociopath only if substantially fewer than 1/2 our chosen psychologists say so!

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(b) Use the binomial distribution to compute the probability of an erroneous decision after n trials, given that the patient is not a sociopath.

## Solution.

We can compute the probability of a wrong decision given that the patient is not a sociopath as follows:

$$\begin{split} \delta_{\text{norm}} &= & \Pr(s/n < d) \text{ (The probability we decided the patient was a sociopath.)} \\ &= & \Pr(s < nd) \\ &= & F_{n,p_{fp}}(nd) \text{ (Cumulative binomial distribution for the random variable s.)} \\ &= & F_{n,1/2}(d) \text{ (Note: } d < 1/2.) \\ &= & \frac{1-d}{1-2d} f_{n,1/2}(nd) \text{ (Theorem 4.1, Lecture 22.)} \end{split}$$

(c) Use the binomial distribution to compute the probability of an erroneous decision after n trials, given that the patient is a sociopath.

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## Solution.

We can compute the probability of a wrong decision given that the patient is a sociopath as

follows:

$$\begin{split} \delta_{\text{soc}} &= \Pr(s/n > d) \text{ (The probability we decided the patient was not a sociopath.)} \\ &= \Pr(\frac{n-s}{n} < 1-d) (n-s = \text{number of "normal" diagnoses}) \\ &= \Pr(n-s < n(1-d)) \\ &= F_{n,1-p_{tp}}(n(1-d)) \text{ (Note: } d > p_{tp} \Rightarrow 1-d < 1-p_{tp}) \\ &= F_{n,p_{fn}}(n(1-d)) \text{ (Pr("normal" diagnosis)} = 1-\Pr(\text{"sociopath" diagnosis})) \\ &= \frac{1-(1-d)}{1-(1-d)/p_{fn}} f_{n,p_{fn}}(n(1-d)) \text{ (Theorem 4.1, Lecture 22.)} \\ &= \frac{dp_{fn}}{p_{fn}-1+d} f_{n,p_{fn}}(n(1-d)) \end{split}$$

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(d) Bound the error of this decision method with a closed-form formula. Solution.

$$\begin{split} \delta &\leq \max\left(\delta_{\text{norm}}, \delta_{\text{soc}}\right) \\ &= \max\left(\frac{1-d}{1-2d}f_{n,1/2}(nd), \frac{dp_{fn}}{p_{fn}-1+d}f_{n,p_{fn}}(n(1-d))\right) \\ &= \max\left(\left(\frac{1-d}{1-2d}\right)\frac{2^{\left(d\log_{2}(2d)+(1-d)\log_{2}\left(\frac{1}{2(1-d)}\right)\right)\cdot n}e^{\frac{1}{e^{a_{n}-a_{dn}}-a_{n-dn}}}}{\sqrt{2\pi d(1-d)n}}, \\ &\left(\frac{dp_{fn}}{p_{fn}-1+d}\right)\frac{2^{\left((1-d)\log_{2}\left(\frac{p_{fn}}{1-d}\right)+d\log_{2}\left(\frac{1-p_{fn}}{d}\right)\right)\cdot n}e^{\frac{1}{e^{a_{n}-a_{(1-d)n}}-a_{n-(1-d)n}}}}{\sqrt{2\pi (1-d)dn}}\right) \end{split}$$

(e) How many independent diagnoses would be needed to get less than 1% error? Solution.

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The question is under specified. The number of diagnoses depends on  $p_{fn}$ . In the worst case,  $p_{fn} = 1/2$  and sociopaths are completely indistinguishable from normal patients. Notice that in this case, d = 0 and  $\delta$  is undefined.

If  $p_{fn}$  is known and greater than 1/2 we can find n by trial and error.

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(f) Is it plausible to assume that psychologists will make their diagnoses independently? Briefly explain.

# Solution.

Not really. The psychologists decisions are not independently random. They are based on observations of the patients behavior. A psychologist diagnoses sociopathy if the patients exhibits certain behavior that the psychologist believes differentiates a sociopath from a normal patient. If the patient's behavior is consistent from one trial to the next and a group of psychologists agree on the behavior typical of sociopaths, then the diagnoses will not be independent of each other.

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