

## Random Variables Intro

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**Random Variable:** A random variable  $X$  is a function from  $\Omega \rightarrow \mathbb{R}$ , mapping the possible outcomes to real numbers. Note that this function itself is not random; the *outcomes* are random. We define

$$\mathbb{P}[X = k] = \mathbb{P}[\{\omega \in \Omega : X(\omega) = k\}].$$

**Distribution** of a random variable: the set of all  $(k, \mathbb{P}[X = k])$ , describing the probability of attaining each value of the random variable.

**Bernoulli Distribution:**  $X \sim \text{Bernoulli}(p)$ ;  $X$  represents the outcome of a biased coin flip.  $X$  is oftentimes also called an *indicator random variable* of an event with probability  $p$ . The distribution is described by the following:

$$\mathbb{P}[X = k] = \begin{cases} p & \text{if } k = 1 \\ 1 - p & \text{if } k = 0 \end{cases}$$

**Binomial Distribution:**  $X \sim \text{Binomial}(n, p)$ ;  $X$  represents the number of successes in  $n$  independent trials, where  $p$  is the probability of success in each trial.

**Geometric Distribution:**  $X \sim \text{Geometric}(p)$ ;  $X$  represents the number of independent trials until the first success (including the success), where  $p$  is the probability of success in each trial.

**Poisson Distribution:**  $X \sim \text{Poisson}(\lambda)$ ;  $X$  represents the number of occurrences of an event in one unit of time, if on average there are  $\lambda$  occurrences in one unit of time. The distribution is described by the following:

$$\mathbb{P}[X = k] = \frac{\lambda^k}{k!} e^{-\lambda}$$

Further, if  $X \sim \text{Poisson}(\lambda_x)$  and  $Y \sim \text{Poisson}(\lambda_y)$  are independent, then  $X + Y \sim \text{Poisson}(\lambda_x + \lambda_y)$ .

## 1 Head Count

Note 15

Consider a coin with  $\mathbb{P}[\text{Heads}] = 2/5$ . Suppose you flip the coin 20 times, and define  $X$  to be the number of heads.

- (a) What is  $\mathbb{P}[X = k]$ , for some  $0 \leq k \leq 20$ ? Express your answer in terms of  $k$ . (Do not just copy down a formula—re-derive it yourself!)

- (b) What is the name of the distribution of  $X$ , and what are its parameters?
- (c) What is  $\mathbb{P}[X \geq 1]$ ? *Hint: You should be able to do this without a summation.*
- (d) What is  $\mathbb{P}[12 \leq X \leq 14]$ ?
- (e) Now consider a second coin also with  $\mathbb{P}[\text{Heads}] = 2/5$ . Suppose you flip this second coin 30 times, and define  $Y$  to be the number of heads. What is the distribution of the *total* number of heads among these two coins, i.e. what is the distribution of  $X + Y$ ?

**Solution:**

- (a) There are a total of  $\binom{20}{k}$  ways to select  $k$  coins to be heads. The probability that the selected  $k$  coins to be heads is  $(\frac{2}{5})^k$ , and the probability that the rest are tails is  $(\frac{3}{5})^{20-k}$ . Putting this together, we have

$$\mathbb{P}[X = k] = \binom{20}{k} \left(\frac{2}{5}\right)^k \left(\frac{3}{5}\right)^{20-k}.$$

- (b) Since we have 20 independent trials, with each trial having a probability  $2/5$  of success, we can write  $X \sim \text{Binomial}(20, \frac{2}{5})$ .
- (c) Note that the probability that there is at least one head is the complement to the probability that there are zero heads. This means that

$$\mathbb{P}[X \geq 1] = 1 - \mathbb{P}[X = 0] = 1 - \left(\frac{3}{5}\right)^{20}.$$

- (d) The only way to write out this expression is as a sum of 3 different probabilities:

$$\begin{aligned} \mathbb{P}[12 \leq X \leq 14] &= \mathbb{P}[X = 12] + \mathbb{P}[X = 13] + \mathbb{P}[X = 14] \\ &= \binom{20}{12} \left(\frac{2}{5}\right)^{12} \left(\frac{3}{5}\right)^8 + \binom{20}{13} \left(\frac{2}{5}\right)^{13} \left(\frac{3}{5}\right)^7 + \binom{20}{14} \left(\frac{2}{5}\right)^{14} \left(\frac{3}{5}\right)^6. \end{aligned}$$

- (e) Since these two coins have the exact same behavior (i.e. the same bias), we can treat this as an experiment where we flip just one coin 50 times. Here, this means that  $X + Y \sim \text{Binomial}(50, \frac{2}{5})$ .

Note that more generally, for two independent binomial random variables  $X \sim \text{Binomial}(n_1, p)$  and  $Y \sim \text{Binomial}(n_2, p)$  with identical success probabilities, we have  $X + Y \sim \text{Binomial}(n_1 + n_2, p)$ , since we're essentially just increasing the number of trials we're considering.

## 2 Head Count II

**Note 19**

Consider a coin with  $\mathbb{P}[\text{Heads}] = 3/4$ . Suppose you flip the coin until you see heads for the first time, and define  $X$  to be the number of times you flipped the coin.

- (a) What is  $\mathbb{P}[X = k]$ , for some  $k \geq 1$ ? Express your answer in terms of  $k$ . (Do not just copy down a formula—re-derive it yourself!)
- (b) What is the name of the distribution of  $X$ , and what are its parameters?
- (c) What is  $\mathbb{P}[X > k]$ , for some  $k \geq 0$ ? (You should not have any summations.)
- (d) What is  $\mathbb{P}[X < k]$ , for some  $k \geq 1$ ? (You should not have any summations.)
- (e) What is  $\mathbb{P}[X > k \mid X > m]$ , for some  $k \geq m \geq 0$ ? Show that your answer is equal to  $\mathbb{P}[X > k - m]$ . Why do we call this the memoryless property?
- (f) Suppose  $X \sim \text{Geometric}(p)$  and  $Y \sim \text{Geometric}(q)$  are independent. Find the distribution of  $\min(X, Y)$  and justify your answer.

**Solution:**

- (a) If we flipped  $k$  times, then we had  $k - 1$  tails and 1 head, in that order, giving us

$$\mathbb{P}[X = k] = \frac{3}{4} \left(1 - \frac{3}{4}\right)^{k-1} = \frac{3}{4} \left(\frac{1}{4}\right)^{k-1}.$$

- (b)  $X \sim \text{Geometric}\left(\frac{3}{4}\right)$

- (c) If we had to flip *more than*  $k$  times before seeing our first heads, then our first  $k$  flips must have been tails, giving us

$$\mathbb{P}[X > k] = \left(1 - \frac{3}{4}\right)^k = \left(\frac{1}{4}\right)^k.$$

You can alternatively write as the sum  $\sum_{i=k+1}^{\infty} \mathbb{P}[X = i] = \sum_{i=k+1}^{\infty} \frac{3}{4} * \left(\frac{1}{4}\right)^{i-1} = \frac{3}{4} * \left(\frac{1}{4}\right)^k * \frac{1}{1-1/4} = \left(\frac{1}{4}\right)^k$  using the formula for an infinite geometric sum

- (d) Notice  $\mathbb{P}[X < k] = 1 - \mathbb{P}[X \geq k] = 1 - \mathbb{P}[X > k - 1]$  since  $X$  can only take on integer values. Along similar lines to the previous part, we then have

$$\mathbb{P}[X < k] = 1 - \mathbb{P}[X > k - 1] = 1 - \left(1 - \frac{3}{4}\right)^{k-1} = 1 - \left(\frac{1}{4}\right)^{k-1}.$$

- (e) By part (c), we have

$$\mathbb{P}[X > k \mid X > m] = \frac{\mathbb{P}[X > k \cap X > m]}{\mathbb{P}[X > m]} = \frac{\mathbb{P}[X > k]}{\mathbb{P}[X > m]} = \left(\frac{1}{4}\right)^{k-m}.$$

However, note that this is exactly  $\mathbb{P}[X > k - m]$ . The reason this makes sense is that if we want to compute the probability that the first heads occurs after  $k$  flips, and we know that the first heads occurs after  $m$  flips, then the first  $m$  flips are tails. Thus, by the independence of the coin flips, the first  $m$  flips don't matter, and so we only need to compute the probability that the first heads occurs after  $k - m$  flips. This is called the **memorylessness property** of the geometric distribution because having flipped the coin  $m$  times without seeing heads doesn't affect the distribution of future flips.

- (f) Let  $X$  be the number of coins we flip until we see a heads from flipping a coin with bias  $p$ , and let  $Y$  similarly be the number of coins we flip until we see a heads from flipping a coin with bias  $q$ .

Imagine we flip the bias  $p$  coin and the bias  $q$  coin at the same time. The minimum of the two random variables represents how many simultaneous flips occur before at least one head is seen.

The probability of not seeing a head at all on any given simultaneous flip is  $(1-p)(1-q)$ ; this corresponds to a failure. This means that the probability that there will be a success on any particular trial is  $1 - (1-p)(1-q) = p+q-pq$ . Therefore,  $\min(X, Y) \sim \text{Geometric}(p+q-pq)$ .

*Alternative 1:* We can also solve this algebraically. The probability that  $\min(X, Y) = k$  for some positive integer  $k$  is the probability that the first  $k-1$  coin flips for both  $X$  and  $Y$  were tails, and we get heads on the  $k$ th toss (this can come from either  $X$  or  $Y$ ). Specifically, this occurs with probability

$$((1-p)(1-q))^{k-1} \cdot (p+q-pq)$$

We recognize this as the formula for a geometric random variable with parameter  $p+q-pq$ .

*Alternative 2:* An alternative, slightly cleaner approach is to work with the *tail probabilities* of the geometric distribution, rather than with the usual point probabilities as above. Let  $Z = \min(X, Y)$ . We can work with  $\mathbb{P}[Z \geq k]$  rather than with  $\mathbb{P}[Z = k]$ ; clearly the values  $\mathbb{P}[Z \geq k]$  specify the values  $\mathbb{P}[Z = k]$  since  $\mathbb{P}[Z = k] = \mathbb{P}[Z \geq k] - \mathbb{P}[Z \geq (k+1)]$ , so it suffices to calculate them instead. We then get the following argument:

$$\begin{aligned} \mathbb{P}[Z \geq k] &= \mathbb{P}[\min(X, Y) \geq k] \\ &= \mathbb{P}[(X \geq k) \cap (Y \geq k)] \\ &= \mathbb{P}[X \geq k] \cdot \mathbb{P}[Y \geq k] && \text{since } X, Y \text{ are independent} \\ &= (1-p)^{k-1} (1-q)^{k-1} && \text{since } X, Y \text{ are geometric} \\ &= ((1-p)(1-q))^{k-1} \\ &= (1-p-q+pq)^{k-1}. \end{aligned}$$

This is the tail probability of a geometric distribution with parameter  $p+q-pq$ , thus we can conclude that  $Z \sim \text{Geom}(p+q-pq)$ , which is the same result as before!

### 3 Shuttles and Taxis at Airport

Note 19

In front of terminal 3 at San Francisco Airport is a pickup area where shuttles and taxis arrive according to a Poisson distribution. The shuttles arrive at a rate  $\lambda_1 = 1/20$  (i.e. 1 shuttle per 20 minutes) and the taxis arrive at a rate  $\lambda_2 = 1/10$  (i.e. 1 taxi per 10 minutes) starting at 00:00. The shuttles and the taxis arrive independently.

- (a) What is the distribution of the following:

- (i) The number of taxis that arrive between times 00:00 and 00:20?
  - (ii) The number of shuttles that arrive between times 00:00 and 00:20?
  - (iii) The total number of pickup vehicles that arrive between times 00:00 and 00:20?
- (b) What is the probability that exactly 1 shuttle and 3 taxis arrive between times 00:00 and 00:20?
- (c) Given that exactly 1 pickup vehicle arrived between times 00:00 and 00:20, what is the conditional probability that this vehicle was a taxi?
- (d) Suppose you reach the pickup area at 00:20. You learn that you missed 3 taxis and 1 shuttle in those 20 minutes. What is the probability that you need to wait for more than 10 mins until either a shuttle or a taxi arrives?

**Solution:**

- (a) (i) Let  $T([0, 20])$  denote the number of taxis that arrive between times 00:00 and 00:20. This interval has length 20 minutes, so the number of taxis  $T([0, 20])$  arriving in this interval is distributed according to  $\text{Poisson}(\lambda_2 \cdot 20) = \text{Poisson}(2)$ , i.e.

$$\mathbb{P}[T([0, 20]) = t] = \frac{2^t e^{-2}}{t!}, \text{ for } t = 0, 1, 2, \dots$$

- (ii) Let  $S([0, 20])$  denote the number of shuttles that arrive between times 00:00 and 00:20. This interval has length 20 minutes, so the number of shuttles  $S([0, 20])$  arriving in this interval is distributed according to  $\text{Poisson}(\lambda_1 \cdot 20) = \text{Poisson}(1)$ , i.e.

$$\mathbb{P}[S([0, 20]) = s] = \frac{1^s e^{-1}}{s!}, \text{ for } s = 0, 1, 2, \dots$$

- (iii) Let  $N([0, 20]) = S([0, 20]) + T([0, 20])$  denote the total number of pickup vehicles (taxis and shuttles) arriving between times 00:00 and 00:20. Since the sum of independent Poisson random variables is Poisson distributed with parameter given by the sum of the individual parameters, we have  $N([0, 20]) \sim \text{Poisson}(3)$ , i.e.

$$\mathbb{P}[N([0, 20]) = n] = \frac{3^n e^{-3}}{n!}, \text{ for } n = 0, 1, 2, \dots$$

- (b) We have

$$\mathbb{P}[T([0, 20]) = 3] = \frac{2^3 e^{-2}}{3!} \text{ and } \mathbb{P}[S([0, 20]) = 1] = \frac{1^1 e^{-1}}{1!}.$$

Since the taxis and the shuttles arrive independently, the probability that exactly 3 taxis and 1 shuttle arrive in this interval is given by the product of their individual probabilities, i.e.

$$\frac{2^3 e^{-2}}{3!} \frac{1^1 e^{-1}}{1!} = \frac{4}{3} e^{-3} \approx 0.0664.$$

- (c) Let  $A$  be the event that exactly 1 taxi arrives between times 00:00 and 00:20. Let  $B$  be the event that exactly 1 vehicle arrives between times 00:00 and 00:20. We have

$$\mathbb{P}[B] = \frac{3^1 e^{-3}}{1!}.$$

Event  $A \cap B$  is the event that exactly 1 taxi and 0 shuttles arrive between times 00:00 and 00:20. Hence

$$\mathbb{P}[A \cap B] = \frac{2^1 e^{-2}}{1!} \frac{1^0 e^{-1}}{0!}.$$

Thus, we get

$$\mathbb{P}[A|B] = \frac{\mathbb{P}[A \cap B]}{\mathbb{P}[B]} = 2/3.$$

- (d) The event that you need to wait for more than 10 minutes starting 00:20 is equivalent to the event that no vehicle arrives between times 00:20 and 00:30. Let  $N[20, 30]$  denote the number of vehicles that arrive between times 00:20 and 00:30. This interval has length 10 minutes, so  $N([20, 30]) \sim \text{Poisson}((\lambda_1 + \lambda_2) \cdot 10) = \text{Poisson}(3/2)$ . Since Poisson arrivals in disjoint intervals are independent, we have

$$\mathbb{P}[N([20, 30]) = 0 \mid T([0, 20]) = 3, S([0, 20]) = 1] = \mathbb{P}[N([20, 30]) = 0] \sim \frac{1.5^0 e^{-1.5}}{0!} = e^{-1.5} \approx 0.2231.$$