The Paradox of the First Collision

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Abstract

In this short report we explain the nature of the above paradox using the context of lottery balls and birthdays, we describe real-world occurrences of this phenomenon and determine the relevant probability formula associated. We'll show this effect in a graphical form and describe how the behaviour of the random variable $X_1^{(n)}$ (the number of repetitions until a singular repeated outcome or "collision" occurs) changes as n increases. Finally, we'll set this result to be a fixed probability and see how k (the number of observed values until a collision occurs) changes as n varies.

1 Introduction

[1] On the 20^{th} of December 1986, an ordinary series of numbers was drawn (15-25-27-30-42-48) in the "Zahlenlotto" in Stuttgart (Germany), exactly the same series of balls was drawn again on the 21^{st} of June 1995 by the same lottery organisation. The "Zahlenlotto" uses balls numbered from 1 to 49, 6 balls are chosen from these randomly and when one is chosen it is not replaced. So the number of ways to choose the 6 balls is:

$$\binom{49}{6} = 13,983,816.$$

Given this many possibilities, and the fact that there had only been roughly 2000 draws overall (balls are drawn once a week), at a glance it seems almost impossible that the same draw could even occur at all within our lifetimes. This report aims to determine a probability formula for how likely this is to occur with different values of n, not just $\binom{49}{6}$; and prove that this is more likely that it might seem...

2 Determining the Formula

Let $X_1^{(n)}$ be the random variable that denotes the number of observations needed until a single repeat of an outcome occurs. To explain this in a simpler way, imagine we wanted to find out the probability of at least two people in a room of M people having the same birthday, so n = 365. Say we number the days of the year $(1 = 01/01/xx, 2 = 02/01/xx, ... 365 = 31/12/xx)^1$, and so the birthdays of these M people gives the sequence:

In this case, $X_1^{(365)} = 5$ since we needed 5 repeats after the first initial observation to achieve the same birthday. Now we need to determine a formula for finding $P[X_1^{(n)} \leq k]$, for some integer k such that $k \leq n$. So we begin by first finding the probability that no collision occurs in a general case where there's n possible values, and we observe k of them. That is like asking: "what is the probability that we don't see any collisions after k observations?" [2]. To do this we consider the first observation when k = 1:

$$P(a_1) = 1$$
 Where $a_1 \in \{a_1, a_2, \dots a_k\}.$

Now consider the probability that the second observation doesn't equate to the first, and also the probability of the third observation not being equal to either of the first two:

$$P(a_1 \neq a_2) = \frac{n-1}{n} = 1 - \frac{1}{n}, \qquad P(a_1 \neq a_2 \neq a_3) = \frac{n-2}{n} = 1 - \frac{2}{n}.$$
 (2.1)

We can use 2.1 to show that for the nth observation:

$$P(a_1 \neq a_2 \dots \neq a_k) = \frac{n - (k - 1)}{n} = 1 - \frac{k - 1}{n}.$$
 (2.2)

So from 2.2 we can conclude, given that the observations are independent (which they are), the probability of no collisions after k observations is as follows:

$$P[X_1^{(n)} > k] = \prod_{i=1}^k P(a_i) = \prod_{i=1}^{k-1} (1 - \frac{i}{n}).$$
 (2.3)

Finally, we can see that the probability of a singular collision after k observations in n values is just the compliment of 2.3:

$$P[X_1^{(n)} \le k] = 1 - \prod_{i=1}^k P(a_i) = 1 - \prod_{i=1}^{k-1} (1 - \frac{i}{n}) \qquad \forall k, n \in \mathbb{N}.$$
 (2.4)

¹Excluding 29/02/xx (the date added on a leap year).

Note that this is a CMF (Cumulative Mass Function); this is because it takes positive integers as an input, and $P[X_1^{(n)} \leq k] \to 1$ as k increments. Also, as we increase our k, we are checking that it's not equal to every other previously observed value. So if we sub a value for k in, we compare all the observed values with each other up to k, so then at this value we will see a single collision with a previous observation. The CMF in 2.5 shows the full definition:²

$$P[X_1^{(n)} \le k] = \begin{cases} 1 - \prod_{i=1}^{k-1} (1 - \frac{i}{n}) & k \in \mathbb{N} \\ 0 & \text{otherwise.} \end{cases}$$
 (2.5)

3 A Graphical Representation

Now that we have found a suitable formula in 2.4 for the likelihood of a single collision in a set of n objects, now we can show how the random variable $X_1^{(n)}$ changes behaviour as n increases. Figure 1 shows the probability of a collision as the number of observed values k increases, this is for the birthday problem where n = 365. Figure 2 shows the same formula applied to the lottery ball example, where $n = \binom{49}{6}$.

Note how the CMFs have been converted to density functions as it is easier to interpret graphically, we still want to model k as a natural number in reality, however we round the values of k in the set $\{k: k > 0, k \in \mathbb{R}, k \notin \mathbb{N}\}$ to the function value found at the nearest natural number of k. In doing this we have made 2.5 into a step function, and so the graphs are only an approximation of the exact values $P[X_1^{(n)} \leq k]$ can take.

²2.1, 2.2, 2.3 and 2.4 were all accumulated from source [2].

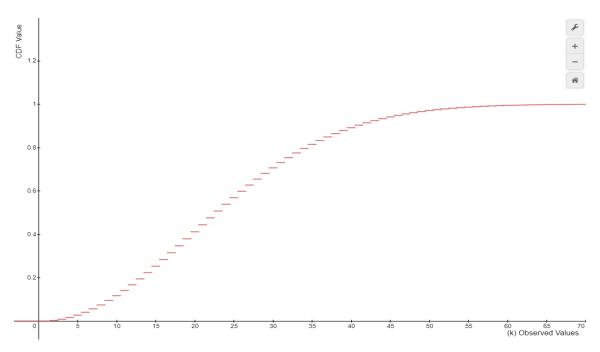


Figure 1: A graph of the probability of a single collision at k with n=365 objects.

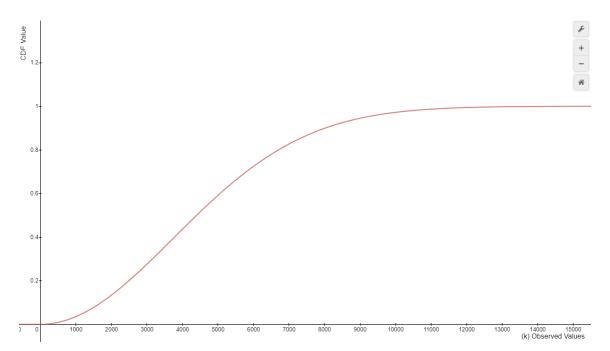


Figure 2: A graph of the probability of a single collision at k with $n = \binom{49}{6}$ objects.

We can see clearly that these CDFs rapidly increase, for example it only takes 23 people in a room for there to be a 50% chance that two of them have the same birthday.

From Figure 1 and Figure 2, we can observe that as n changes, the variable $X_1^{(n)}$ retains its behaviour, however it reaches close to $\mathbf{1}$ faster compared to the value of n for larger values of n. For example, when n=365 then the probability reaches nearly $\mathbf{1}$ slowly at around k=70; however for $n=\binom{49}{6}$, it appears to reach $\mathbf{1}$ almost instantly at around k=13,000 which is very small in proportion to such a large value of n. The chance of a collision starts off small with low values of k, then builds very quickly at a point depending on how large n is; as discussed earlier.

We can now use 2.4 to determine the value of k for a given probability by solving for k; for example in the birthday and lotto scenarios we have:

$$P[X_1^{(365)} \le k] = 1 - \prod_{i=1}^{k-1} (1 - \frac{i}{365}) = 0.95$$
 Here, $k = 46$
$$P[X_1^{\binom{49}{6}} \le k] = 1 - \prod_{i=1}^{k-1} (1 - \frac{i}{\binom{49}{6}}) = 0.95$$
 Here, $k = 7,490$

4 Conclusion

In this investigation we found the formula of the probability that a singular collision will occur after k observed values where each observation can take n different values. This formula is shown formally in 2.5. This was then presented graphically, however it needed to be converted to a density function where $k \in \mathbb{R}$ (as opposed to k being a natural number). This is because plotting a CMF would give function values of infinitely small line width at each k in the domain, so it would have been hard to see properly the behaviour of the variable $X_1^{(n)}$. Using a small value of n = 365 and an extremely large value of $n = \binom{49}{6}$, we saw that the CMF increases close to 1 sooner in proportion to the value of n when n is larger and later when n is smaller. The CMF value was then fixed to 0.95 for these values of n to see how k behaves.

The formula derived in 2.5 can now finally explain how the "Zahlenlotto" situation happened. After only 2000 draws (so k = 2000), and with $n = \binom{49}{6}$, plugging the numbers produces a 13% chance that the next draw of balls will be the same as one that had already been drawn prior. All of a sudden the chance of this happening seems a lot more likely than one might initially postulate...

References

- [1] Elek, G. (2019). Short project: The paradox of the first collision. file://lancs/homes/38/pollardg/Downloads/GE%20(2).pdf.~1
- [2] redshiftzero(github) (2017). Collision attacks and the birthday paradox. $https://redshiftzero.github.io/birthday-attacks/.\ 2,\ 3$