

1 Problem Statement

Given a 75% probability that a soccer player will make any penalty kick,¹ what is the chance that any shootout will go into extra shots? (There are usually 5 rounds, one shot each per team, and if tied after this, extra rounds until there is a winner)

2 Answer

To find the answer analytically requires thinking about the probability of how the five shots for each team go. We can think of each team as a sequence of five shots such as

$$A = (0, 1, 0, 1, 0) B = (1, 0, 1, 0, 0) \quad (1)$$

where 1 means made the penalty kick and 0 means missed.

Let's first do the case of equal probability of making and missing to get a feel for the problem. In that case we want the probability that the sum of sequences A and B are equal after 5 shots. We can summarize this with the binomial theorem

$$(a + b)^5 = a^5 + 5a^4b + 10a^3b^2 + 10a^2b^3 + 5ab^4 + b^5 \quad (2)$$

where a is the probability of making a shot and b is the probability of missing a shot. We see there is only one way to miss all shots and one way to make all shots. There are 5 ways of making 4 and missing one (and vice versa) and 10 ways of making 3 shots and missing 2 (and vice versa).

For any number A gets we can just use the probability of team B getting the same shot is the corresponding coefficient above. So for A making 3 shots and missing 2, B has a probability $10(0.5)^3(0.5)^2 = 10(0.5)^5 = 10/32 \approx 0.3125$.

This means we can square all of the probabilities and add them up to find our answer.² This yields

$$2 \frac{1 + 5^2 + 10^2}{2^{10}} \approx 0.246 \quad (3)$$

In the case $a = 0.75$ and $b = 0.25$, then we use the above formula and find

$$\begin{aligned} & (0.75)^{10} + 5^2(0.75)^8(0.25)^2 + 10^2(0.75)^6(0.25)^4 + 10^2(0.75)^4(0.25)^6 \\ & + 5^2(0.75)^2(0.25)^8 + (0.25)^{10} \approx 0.290 \end{aligned} \quad (4)$$

Indeed, for any of possible probability a and b (so $b = 1 - a$) the answer is

$$\sum_{i=0}^5 \binom{5}{i} a^{2(5-i)} b^{2i} \quad (5)$$

To confirm this, we can use simulation again.

¹Each kick is thus independent of the other kicks.

²When team A gets 4 shots in, it has a probability of $5a^4b$. The chance team B then gets 4 shots in is also $5a^4b$. So the probability of these happening when each kick is independent is simply multiplying the probabilities together.

penalty_kicks.py

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3
4 # Inspired from fivethirtyeight Riddler
5 # from July, 13, 2018
6 np.random.seed(1)
7
8 # calculates probability via simulation
9 # of many penalty kicks
10 # not worth optimizing to remove
11 # cases where we do not need to do all
12 # five kicks. (In any case, these
13 # should not affect the probability)
14 # Using array operations with numpy
15 # will almost certainly be faster
16 # than any loops
17 def penalty_kicks(trials):
18     trials=int(trials)
19     a=np.zeros((5, trials))
20     b=np.zeros((5, trials))
21     # put ones in for making goals
22     mask1=np.random.rand(5, trials)
23     mask2=np.random.rand(5, trials)
24     mask1=np.where(mask1<.75)
25     mask2=np.where(mask2<.75)
26     a[mask1]=1
27     b[mask2]=1
28     # find total goals
29     a=np.sum(a,0)
30     b=np.sum(b,0)
31     #determine who wins
32     c=a-b
33     # find where c=0
34     nowins=1-np.count_nonzero(c)/float(trials)
35     print(nowins)
36     return nowins
37
38
39 a=penalty_kicks(5e5)
40 b=penalty_kicks(5e5)
41 c=penalty_kicks(5e5)
```