

Data Structures and Algorithms

Tutorial 2: Shuffling an Array

Naive Shuffle

Consider the following algorithm to Shuffle an array: draw elements randomly from the original array A , and mark taken elements using an array C so we don't take them away. To chose an element, just call RANDOM to generate a new index as long as the corresponding element has already been taken. We will assume that calls to RANDOM use a constant time to return values following a uniform distribution.

Input: an array A

Output: a shuffled copy of A

```
NAIVESHUFFLE( $A$ )
1   $n \leftarrow \text{length}(A)$ 
1  for  $i \leftarrow 1$  to  $n$  do  $C[i] \leftarrow 0$ 
2  for  $i \leftarrow 1$  to  $n$  do
3    do
4       $j \leftarrow \text{RANDOM}(1, n)$ 
5      until  $C[j] = 0$ 
6       $C[j] \leftarrow 1$ 
7       $B[i] \leftarrow A[j]$ 
8  return  $B$ 
```

Questions:

1. Explain why this algorithm may not terminate.
2. Among the cases where the algorithm do terminate, what is the run-time complexity of the best case scenario to shuffle an array of size n with this algorithm?
3. Let t_i be a *random variable* (or *stochastic variable*) denoting the number of calls to RANDOM during the i -th iteration.

(a) The probability that the second iteration makes only one call to RANDOM is

$$\Pr\{t_2 = 1\} = \frac{n-1}{n}$$

because there are $n-1$ possible free values to choose from the n . What is the probability $\Pr\{t_{i+1} = k+1\}$ to make $k+1$ calls to RANDOM (that means k unlucky random calls followed by 1 good call) after i values have already been taken?

(b) Deduce the expected value $E[t_{i+1} - 1]$.

(c) Finally give the order (using Θ notation) of the average number of calls to RANDOM: $\sum_{i=1}^n E[t_i]$.

4. Among all scenarios what is the probability of getting a best case?

The Modern Fisher-Yates Shuffle

This shuffle is also known as the *Knuth Shuffle*.

Input: an array A

Output: the array A shuffled in place

FISHERYATESSHUFFLE(A)

```
1  $n \leftarrow \text{length}(A)$ 
2 for  $i \leftarrow 1$  to  $n - 1$  do
3    $j \leftarrow \text{RANDOM}(i, n)$ 
4    $A[i] \leftrightarrow A[j]$ 
```

Questions:

1. Explain why this algorithm always terminates.
2. What is the run-time complexity of this algorithm?
3. How can we justify that this algorithm is *unbiased*? (i.e., That it can generate all permutation with equal chance.)

Inside-Out Fisher-Yates Shuffle

Sometimes you do not want an array to be shuffle in place. This version of the algorithm will shuffle the array as it is being copied.

Input: an array A

Output: a shuffled copy of A

INSIDEOUTFISHERYATESSHUFFLE(A)

```
1  $n \leftarrow \text{length}(A)$ 
2  $B[1] \leftarrow A[1]$ 
3 for  $i \leftarrow 2$  to  $n$  do
4    $j \leftarrow \text{RANDOM}(1, i)$ 
5    $B[i] \leftarrow B[j]$ 
6    $B[j] \leftarrow A[j]$ 
7 return  $B$ 
```

Questions:

1. Is this algorithm is *unbiased*?
2. What is its run-time complexity?
3. Such a shuffle could also be done by copying A on B and then calling FISHERYATESSHUTTLE(B). What would be the complexity of doing that?
4. Why would we prefer INSIDEOUTFISHERYATESSHUFFLE over copy+FISHERYATESSHUTTLE?