(Pseudo)Random Number Generation

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Outline

Introduction

Middle Squares Method

Linear Congruential Generator

XorShift



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• This does pose some issues when it comes to generating massive numbers, as well as being very inefficient and slow.

Thus, we must turn to algorithms to generate *pseudorandom* numbers.



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We can visualize this using random walks, which show the progression and relation between a set of generated numbers by plotting the distance between two consecutive numbers in a set of numbers.



Truly Random Visualization





Pseudorandom Visualization





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Thus, to generate random 3-digit numbers with a seed of 186, we get: $186^2 = 34596 \rightarrow 459, 459^2 = 210681 \rightarrow 068, 68^2 = 4624 \rightarrow 624, 624^2 = 389376 \rightarrow 937, 937^2 = 877969 \rightarrow 796, and so on.$



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Once you get a repeat number, it's easy to see that the numbers will start to repeat from there. Some seeds will have a longer period than others.



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Where:

- X_n is the current seed
- X_{n+1} is the next pseudorandom number
- *a* is the multiplier
- c is the increment
- m is the modulus
- Assume all are non-zero



Example LCG Computation

Given arbitrary parameters: m = 79, a = 43, c = 15, $X_0 = 21$

1.
$$X_1 = (43 \cdot 21 + 15) \mod 79$$

 $43 \cdot 21 = 903 \rightarrow 903 + 15 = 918 \rightarrow 918 \mod 79 = 63$ $X_1 = 63$

2.
$$X_2 = (43 \cdot 63 + 15) \mod 79$$

 $43 \cdot 63 = 2709 \rightarrow 2709 + 15 = 2724 \rightarrow 2724 \mod 79 = 9$
 $X_2 = 9$
3. $X_3 = (43 \cdot 9 + 15) \mod 79$
 $43 \cdot 9 = 387 \rightarrow 387 + 15 = 402 \rightarrow 402 \mod 79 = 7$
 $X_3 = 7$

We get a sequence of 21, 63, 9, 7, 0, 15, 34, and so on.



XorShift

General Process:

- 1. Pick a seed and convert it to binary.
- 2. Perform a bit shift either left or right and any amount.
- 3. Perform the Xor operation (\oplus) on the numbers in steps 1 and 2.
- 4. Repeat steps 1-3 as many times as you want, reversing the direction of the bit shift each time.
- 5. Convert the final number back to decimal.



Example with Arbitrary Seed 3146505

Step	Result of Operation		
Initial	$0000 \ 0000 \ 0011 \ 0000 \ 0000 \ 0011 \ 0000 \ 1001$		
Left Shift $\ll 13$	$0001 \ 1000 \ 0000 \ 0000 \ 0000 \ 0000 \ 0000 \ 0000$		
Xor1: $12345 \oplus (12345 \ll 13)$	$0001 \ 1000 \ 0011 \ 0000 \ 0000 \ 0011 \ 0000 \ 1001$		
Right Shift $\gg 17$	0000 0000 0000 0001 1000 0000 0000 0000		
Xor2: Previous \oplus (Previous $\gg 17$)	0001 1000 0011 0001 1000 0011 0000 1001		
Left Shift $\ll 5$	$0011 \ 0000 \ 0110 \ 0010 \ 0000 \ 0110 \ 0010 \ 0000$		
Xor3: Previous \oplus (Previous \ll 5)	$0010 \ 1000 \ 0101 \ 0011 \ 1000 \ 0101 \ 0010 \ 1001$		



Results

Iteration	Initial Seed	Operations	Result
0	3146505	Initial seed	3146505
1	3146505	$3146505 \oplus (3146505 \ll 13)$	405799689
2	405799689	$405799689 \oplus (405799689 \gg 17)$	405897993
3	405897993	$405897993 \oplus (405897993 \ll 5)$	676562217

Pseudorandom number: 676562217





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Summary

Middle Squares, LCG, and XorShift are three fairly simple pseudorandom number generation algorithms.

All three can be completed in constant time, making them suitable for real-time simulation number generation.

This does mean that neither is great for cryptographic purposes, which often use many complex processes like entropy pools, block ciphers, and sometimes even truly random numbers from physical processes as I mentioned earlier. I highly recommend reading up on these as they are very interesting!



Questions?

