

Performance Modeling of Computer Systems and Networks

Prof. Vittoria de Nitto Personè

Lehmer Generators Implementation

Università degli studi di Roma Tor Vergata
Department of Civil Engineering and Computer Science Engineering

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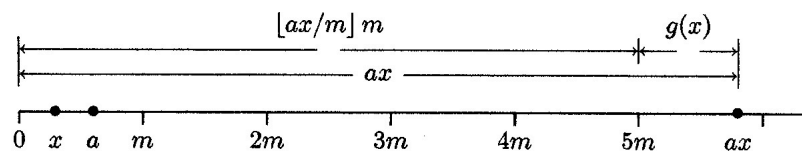


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Pseudo-random Generators implementation

Overflow Is Possible

- Recall that $g(x) = ax \bmod m$
- The ax product can be as big as $a(m-1)$



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- If integers $> m$ cannot be represented, integer overflow is possible!
- Not possible to evaluate $g(x)$ in "obvious" way

Example 1: m decomposition

- consider $(a, m) = (48271, 2^{31}-1)$

$$q = \lfloor m/a \rfloor = 44488 \quad r = m \bmod a = 3399 < 44488 = q$$

- consider $(a, m) = (16807, 2^{31}-1)$

$$q = \lfloor m/a \rfloor = 127773 \quad r = m \bmod a = 2836 < 127773 = q$$

- In both cases $r < q$

This characteristic is important!!
(*modulus-compatible*)

Rewriting $g(x)$ to avoid overflow

$$\begin{aligned}
 g(x) &= ax \bmod m \\
 &= ax - m \lfloor ax/m \rfloor \\
 &= ax + [-m \lfloor x/q \rfloor + m \lfloor x/q \rfloor] - m \lfloor ax/m \rfloor \\
 &= [ax - (aq+r) \lfloor x/q \rfloor] + [m \lfloor x/q \rfloor - m \lfloor ax/m \rfloor] \\
 &= [a(x - q \lfloor x/q \rfloor) - r \lfloor x/q \rfloor] + [m \lfloor x/q \rfloor - m \lfloor ax/m \rfloor] \\
 &= [a(x \bmod q) - r \lfloor x/q \rfloor] + m [\lfloor x/q \rfloor - \lfloor ax/m \rfloor] \\
 &= \gamma(x) + m \delta(x)
 \end{aligned}$$

where

$$\begin{aligned}
 \gamma(x) &= a(x \bmod q) - r \lfloor x/q \rfloor \quad \text{and} \\
 \delta(x) &= \lfloor x/q \rfloor - \lfloor ax/m \rfloor
 \end{aligned}$$

Note: mods are done before multiplications!!!

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Characterization of $\delta(x)$

Theorem 2.2.1

$$g(x) = \gamma(x) + m \delta(x)$$

If $m = aq+r$ is prime and $r < q$, for $x \in \chi_m$

$$\delta(x) = 0 \quad \text{or} \quad \delta(x) = 1$$

where

$$\delta(x) = \lfloor x/q \rfloor - \lfloor ax/m \rfloor$$

moreover

$$\delta(x) = 0 \quad \text{iff} \quad \gamma(x) \in \chi_m$$

$$\delta(x) = 1 \quad \text{iff} \quad -\gamma(x) \in \chi_m$$

where

$$\gamma(x) = a(x \bmod q) - r \lfloor x/q \rfloor$$

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Computing $g(x)$

- evaluates $g(x) = ax \bmod m$ with no values $> m-1$

Algorithm 1

```

t = a * (x % q) - r * (x / q);      /* t =  $\gamma(x)$  */
if (t > 0)                          /*  $\delta(x) = 0$  */
    return (t);
else
    return (t + m);                /*  $\delta(x) = 1$  */

```

- returns $g(x) = \gamma(x) + m \delta(x)$
- the ax product is “trapped” in $\delta(x)$
- no overflow !!

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Modulus compatibility

- we must have $r < q$ in $m = aq + r$
- multiplier a is *modulus-compatible* (MC) with m iff $r < q$
- choose a MC with $m = 2^{31}-1$, then algorithm 1 can port to any 32-bit machine
- e.g.: $a=48271$ is MC with $m=2^{31}-1$
 $r = 3399 \quad q = 44\,488$

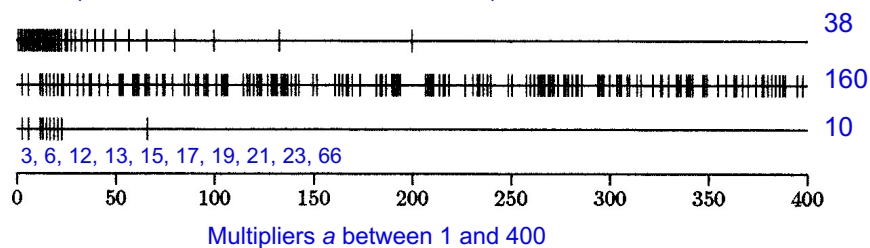
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Modulus-Compatible MC and Full-Period FP

- no MC multipliers $> (m-1)/2$
- more densely distributed on low end $[0, m-1]$
- consider a tiny modulus $m=401$:
(row 1: MC; row 2: FP; row 3: MC & FP)



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MC and smallness

- multiplier a is "small" iff $a^2 < m$
- if a is small, then a is MC
all multipliers from 1 to $\lfloor \sqrt{m} \rfloor = 46340$ are MC
- if a is MC, a is not necessarily small
 $a=48271$ is MC with $2^{31}-1$ but is not small
- start with a small (therefore MC) multiplier
search until the first FP multiplier is found

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Example: FPMC multipliers for $m = 2^{31}-1$

- For $m=2^{31}-1$ and FPMC $a=7$, there are 23093 FPMC multipliers

$$\begin{aligned} 7^1 \bmod 2147483647 &= 7 \\ 7^5 \bmod 2147483647 &= 16807 \\ 7^{113039} \bmod 2147483647 &= 41214 \\ 7^{188509} \bmod 2147483647 &= 25697 \\ 7^{536035} \bmod 2147483647 &= 63295 \\ &\vdots \end{aligned}$$

- $a = 16807$ is a “minimal” standard
- $a = 48271$ provides (slightly) more random sequences

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Randomness

- choose the FPMC multiplier that gives “most random” sequences
- no universal definition of randomness
- in 2-space $(x_0, x_1), (x_1, x_2), (x_2, x_3), \dots$ form a lattice structure

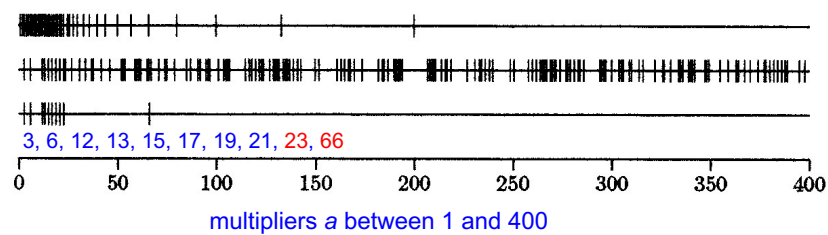
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Pseudo-random Generators
implementation

- the first row shows 38 multipliers MC
- the second row shows 160 multipliers FP
- the third row shows 10 multipliers MC and FP

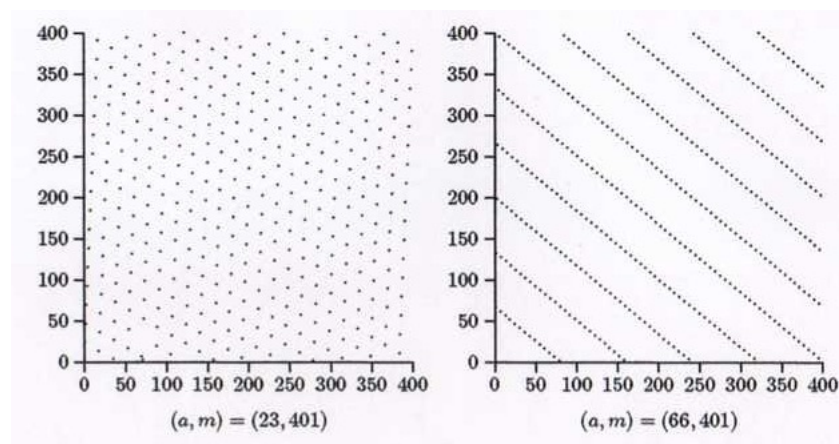


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Pseudo-random Generators
implementation



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Lehmer generator implementation with $(a,m) = (48271, 2^{31} - 1)$

```
Random(void) {
    static long state = 1;
    const long A = 48271;           /* multiplier */
    const long M = 2147483647;      /* modulus */
    const long Q = M / A;           /* quotient */
    const long R = M % A;           /* remainder */
    long t = A * (state % Q) - R * (state / Q);
    if (t > 0)
        state = t;
    else
        state = t + M;
    return ((double) state / M);
}
```

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A Not-As-Good RNG Library

- ANSI C library `<stdlib.h>` provides the function `rand()`
- simulates drawing from $1, 2, \dots, m-1$ with $m \geq 2^{15} - 1$
- value returned is not normalized; typical to use

$$u = (\text{double}) \text{rand}() / \text{RAND_MAX};$$
- ANSI C standard does not specify algorithm details
- for scientific work, avoid using `rand()` !!!

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<http://www.cplusplus.com/reference/cstdlib/rand/>

rand

<cstdlib>

```
int rand (void);
```

Generate random number

Returns a pseudo-random integral number in the range between 0 and `RAND_MAX`.

This number is generated by an algorithm that returns a sequence of apparently non-related numbers each time it is called. This algorithm uses a seed to generate the series, which should be initialized to some distinctive value using function `srand`.

`RAND_MAX` is a constant defined in <cstdlib>.

A typical way to generate trivial pseudo-random numbers in a determined range using `rand` is to use the modulo of the returned value by the range span and add the initial value of the range:

```
1 v1 = rand() % 100;      // v1 in the range 0 to 99
2 v2 = rand() % 100 + 1;  // v2 in the range 1 to 100
3 v3 = rand() % 30 + 1985; // v3 in the range 1985-2014
```

Notice though that this modulo operation does not generate uniformly distributed random numbers in the span (since in most cases this operation makes lower numbers slightly more likely).

C++ supports a wide range of powerful tools to generate random and pseudo-random numbers (see <random> for more info).

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Pseudo-random Generators implementation

- defined in the source files `rng.h` and `rng.c`
- based on the implementation considered here


```
double Random(void)
void PutSeed(long seed)
void GetSeed(long *seed)
void TestRandom(void)
```
- initial seed can be set directly, via prompt or by system clock
- `PutSeed()` and `GetSeed()` often used together
- `a=48271` is the default multiplier

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Example using the RNG

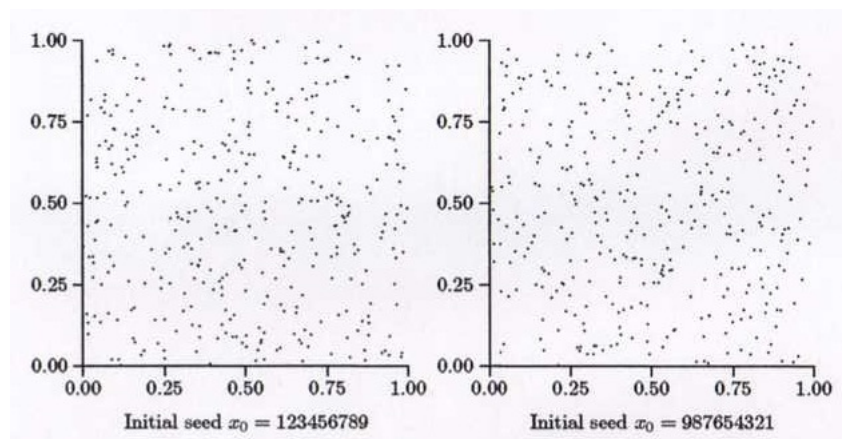
- generates 400 2-space points at random

```
seed = 123456789;      /* or 987654321 */
PutSeed(seed);
x0 = Random();
for (i = 0; i < 400; i++) {
    xi+1 = Random();
    Plot(xi, xi+1);    /* graphics function */
}
```

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Observations on Randomness

- no lattice structure is evident
- appearance of randomness is an illusion
- if all $m - 1 = 2^{31} - 2$ points were generated, lattice would be evident
- herein lies distinction between *ideal* and *good* generator !!

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Example

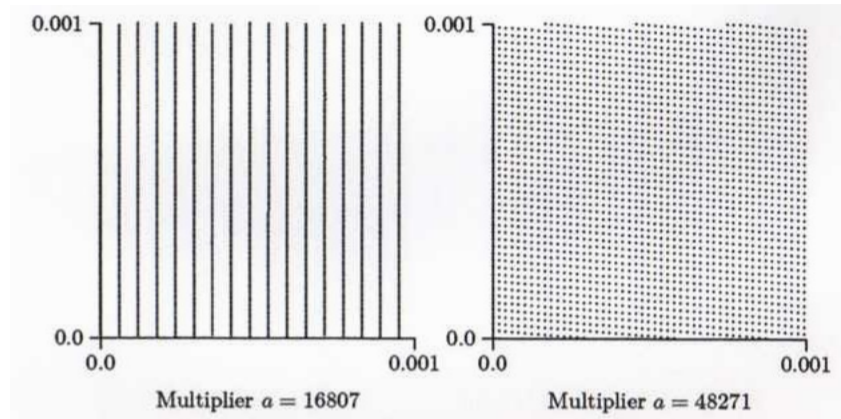
- plotting all pairs (x_i, x_{i+1}) for $m = 2^{31} - 1$ would give a black square
- any tiny square should appear approximately the same
- zoom in the square with opposite corners $(0, 0)$ and $(0.001, 0.001)$

```
seed = 123456789;
PutSeed(seed);
x0 = Random();
for (i = 0; i < 2147483646; i++) {
    xi+1 = Random();
    if ((xi < 0.001) and (xi+1 < 0.001))
        Plot(xi, xi+1);
}
```

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- further justification for using $a=48271$ over $a=16807$

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considerations

- only 20 random numbers were needed
- seed $x_0 = 109.869.724$
- resulting 20 random numbers

0.64 0.72 0.77 0.93 0.82 0.88 0.67 0.76 0.84 0.84
0.74 0.76 0.80 0.75 0.63 0.94 0.86 0.63 0.78 0.67

not discard outliers



Replicating simulation many times!!!!
So averaging the unusual cases

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