

# 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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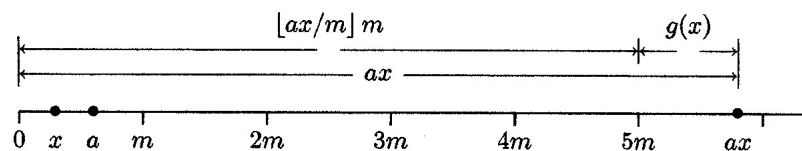


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## Pseudo-random Generators implementation

### 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  $(a, m) = (48271, 2^{31}-1)$  32 bit, 48271 considerato miglior generatore.

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

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

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

- In both cases  $r < q$  caratteristica "modulo compatibile".

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

## Rewriting $g(x)$ to avoid overflow

$$\begin{aligned}
 g(x) &= ax \bmod m && \text{banalmente passiamo da un prodotto ad una somma.} \\
 &= ax - m \lfloor ax/m \rfloor \\
 &= ax + [-m \lfloor x/q \rfloor + m \lfloor x/q \rfloor] - m \lfloor ax/m \rfloor \\
 &= [ax - (aq+r) \lfloor x/q \rfloor] + [m \lfloor x/q \rfloor - m \lfloor ax/m \rfloor] \\
 &= [a(x - q \lfloor x/q \rfloor) - r \lfloor x/q \rfloor] + [m \lfloor x/q \rfloor - m \lfloor ax/m \rfloor] \\
 &= [a(x \bmod q) - r \lfloor x/q \rfloor] + m [\lfloor x/q \rfloor - \lfloor ax/m \rfloor] \\
 &= \gamma(x) + m \delta(x)
 \end{aligned}$$

where viene fatto prima il modulo, dopo si moltiplica.

$$\gamma(x) = a(x \bmod q) - r \lfloor x/q \rfloor \quad \text{and}$$

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

questa seconda funzione non la calcolo proprio!

Note: mods are done before multiplications!!!

## 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  $x \in \chi_m$  ovvero sto in modulo compatibilità

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

where

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

moreover

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

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

devo vedere l'altra funzione gamma, se positivo allora ho  $\delta(x) = 0$ , altrimenti vale 1.

where

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

## 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 !!

## 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  $m=2^{31}-1$   
 $r = 3399 \quad q = 44\,488$

Non bisogna mai usare generatori random senza saperne le specifiche.

Pseudo-random Generators  
implementation

## Modulus-Compatible MC and Full-Period FP

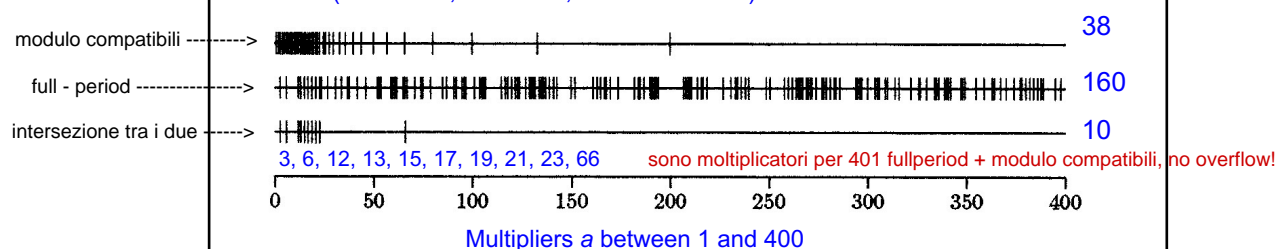
- no MC multipliers  $> (m-1)/2$

- more densely distributed on low end  $[0, m-1]$

i modulo compatibili sono più vicini allo '0' rispetto ad 'm'.

- 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

dettagli non troppo rilevanti

- 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

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

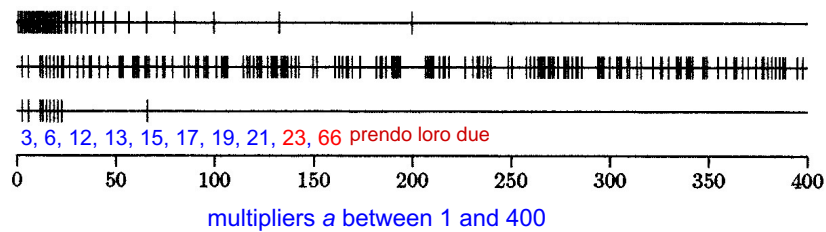
- $a=16807$  is a “minimal” standard
- $a=48271$  provides (slightly) more random sequences

## 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

Se rivediamo graficamente l'esempio di prima con  $m=13$ , abbiamo sempre una struttura geometrica detta "Lattice"

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

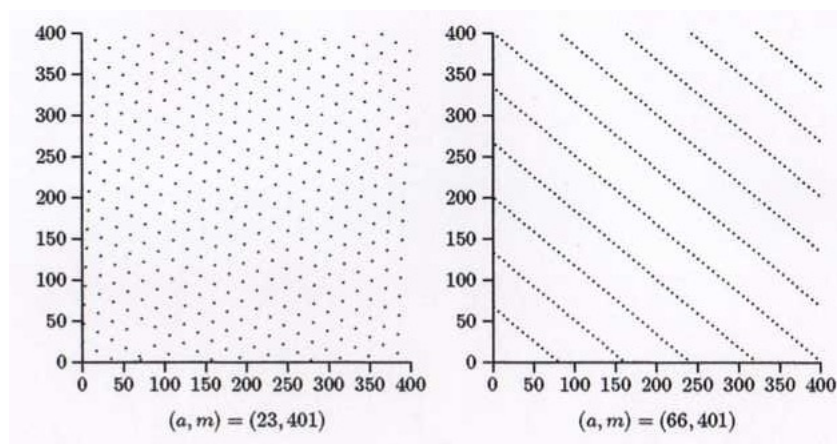


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In entrambi i casi sono strutture a "lattice", ma la prima sembra coprire meglio l'area, la seconda ha più vuoti.



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

```
Random(void) {                                implementazione "vera" in C.
    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 = (double) rand() / RAND_MAX;`
- ANSI C standard does not specify algorithm details
- for scientific work, avoid using `rand()` !!!

la `rand()` di `stdlib` non specifica nel dettaglio l'algoritmo, non essendo ben documentata è meglio evitarla per lavori scientifici.

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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

Nostro generatore di Lehmer.

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

```
double Random(void)    estrae il nostro 'u'
void PutSeed(long seed) mette il 'seme', se seed=0 il seme viene chiesto da tastiera,
void GetSeed(long *seed) se metto seed = -1 viene scelto il clock del sistema.
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

per replicare un esperimento, devo conoscere il seme, e questo lo faccio con `getSeed`, o anche per conoscere a quale punto della 'ruota' sono. Ogni volta che faccio 'random' vado avanti nella ruota.

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## Example using the RNG

- generates 400 2-space points at random

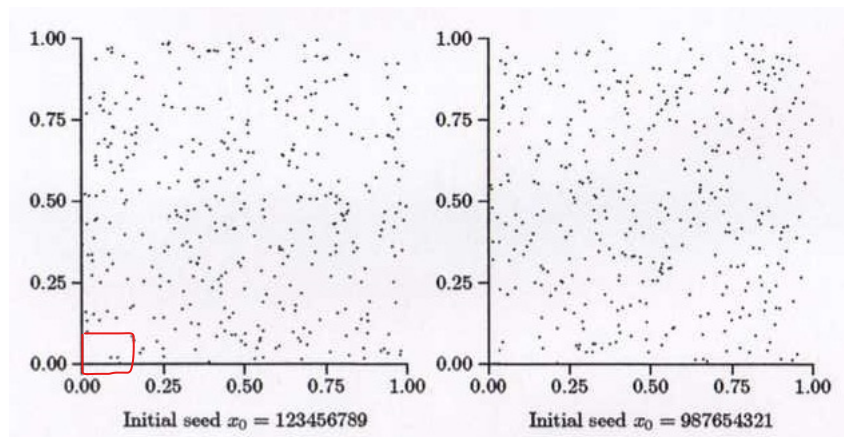
```
seed = 123456789;          /* or 987654321 */
PutSeed(seed);             inizializzo generatore con tale seme
x0 = Random();             inizio generazione a partire da quel seme.
for (i = 0; i < 400; i++) {
    xi+1 = Random();        genero 400 valori
    Plot(xi, xi+1);       e li plotto, ognuno col successivo.
                           /* grafics function */
}
```

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Sto generando 'solo' 400 punti, sembra randomico.  
Non vedo struttura lattice.



Se zoommassi in un "quadrato" ?

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## Observations on Randomness

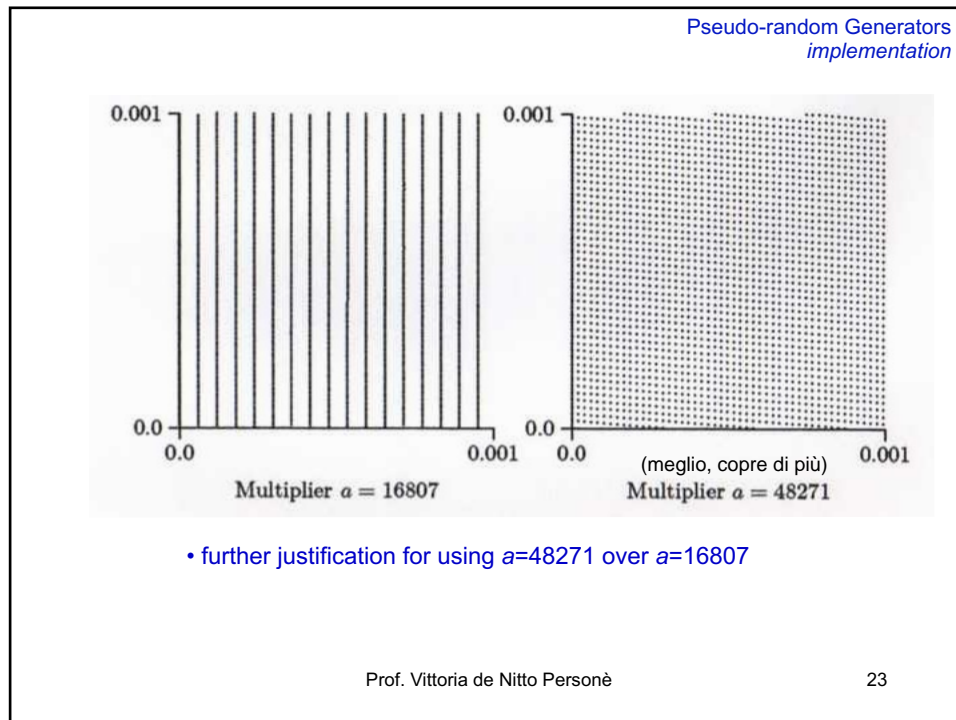
- no lattice structure is evident
- appearance of randomness is an illusion
- if all  $m - 1 = 2^{31} - 2$  points were generated, lattice would be evident
- herein lies distinction between *ideal* and *good* generator !!

## 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++) {    stavolta li genero tutti in un piccolo "quadrato"
    xi+1 = Random();
    if ((xi < 0.001) and (xi+1 < 0.001))
        Plot(xi, xi+1);
}
```

E' lo stesso generatore, STESSO SEME, solo che prima ho generato solo '400' punti, qui li genero tutti in un "quadrato" 0.01 x 0.01



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implementation

Mi servono 20 numeri random con Lehmer, con seme  $x_0$ .  
Ottengo quei numeri random, sono tutti  $> 0.62$

### 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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Sembra strano che tutti i valori siano  $> 0.62$ , dovrei buttare tutto? NO.  
L'idea è quindi quella di non buttare mai nulla, perchè i casi particolari esistono, bensì dobbiamo replicare la simulazione più volte per "limitare" questi casi particolari.