Performance Modeling of Computer Systems and Networks

Prof. Vittoria de Nitto Personè

Discrete-Event Simulation

Università degli studi di Roma Tor Vergata

Department of Civil Engineering and Computer Science Engineering

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Multi-Stream Lehmer RNGs

- Typical DES models have many stochastic components
- Want a unique source of randomness for each component
- One (poor) option: multiple RNGs
- Better option: one RNG with multiple "streams" of random numbers

one stream per stochastic component



We will partition output from our Lehmer RNG into multiple streams

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Case study ssq

Arrival and service processes

- · two stochastic components: arrival and service
- · allocate a different state variable to each

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```

• x represents the current state of the service process

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Case study ssq

Arrival and service processes

Arrival should have its own static variable, initialized differently

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```

• x represents the current state of arrival process

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The Modified Arrival and Service Processes

- As modified, arrival and service times are drawn from different streams of random numbers
- Provided the streams don't overlap → the processes are uncoupled
- · Execution time cost is negligible

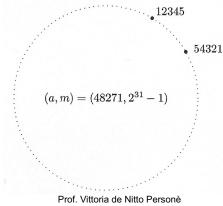
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Pseudo-random generators Lehmer multi-stream

- Potential problem: assignment of initial seeds to produce disjoint streams
- · If states are picked at whim, no guarantee of disjoint streams
- Some initial states may only be a few calls to Random apart!



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Jump Multipliers

· We will develop a multi-stream version of rng

Theorem

Given $g(x) = ax \mod m$ and integer j (1<j<m-1)

jump function: $g^{j}(x) = (a^{j} \mod m)x \mod m$

jump multiplier: $a^j \mod m$

If $g(\cdot)$ generates $x_0, x_1, x_2,...$ then $g^j(\cdot)$ generates $x_0, x_j, x_{2j},...$

• This theorem is the key to creating streams

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Pseudo-random generators Lehmer multi-stream

Example 1

- If m = 31, a = 3 and j = 6, the jump multiplier is $a^{j} \mod m = 3^{6} \mod 31 = 16$
- If $x_0 = 1$, then $g(x) = 3x \mod 31$ generates:

 $\begin{matrix} 1,\,3,\,9,\,27,\,19,\,26,\,16,\,17,\,20,\,29,\,25,\,13,\,8,\,24,\,10,\,30,\,28,\\ 22,\,4,\,12,\,5,\,15,\,14,\,11,\,2,\,6,\,18,\,23,\,7,\,21,\,1,\,\ldots \end{matrix}$

• The jump function $g^6(x) = 16x \mod 31$ generates:

1, 16, 8, 4, 2, 1, . . .

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Example 1

• If m = 31, a = 3 and j = 6, the jump multiplier is

 $a^{j} \mod m = 3^{6} \mod 31 = 16$

• If $x_0 = 1$, then $g(x) = 3x \mod 31$ generates:

<u>1</u>, 3, 9, 27, 19, 26, <u>16</u>, 17, 20, 29, 25, 13, <u>8</u>, 24, 10, 30, 28, 22, <u>4</u>, 12, 5, 15, 14, 11, <u>2</u>, 6, 18, 23, 7, 21, <u>1</u>, . . .

• The jump function $g^6(x) = 16x \mod 31$ generates:

1, 16, 8, 4, 2, 1, . . .

• I.e., the first sequence is $x_0, x_1, x_2,...$; the second is $x_0, x_6, x_{12},...$

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Pseudo-random generators Lehmer multi-stream

Example 1

m = 31, a = 3, $x_0 = 1$

<u>1</u>, 3, 9, 27, 19, 26, <u>16</u>, 17, 20, 29, 25, 13, <u>8</u>, 24, 10, 30, 28, 22, <u>4</u>, 12, 5, 15, 14, 11, <u>2</u>, 6, 18, 23, 7, 21, <u>1</u>, . . .

 $x_0 = 1, 3, 9, 27, 19, 26,$

 $x_6 = 16, 17, 20, 29, 25, 13,$

 $x_{12} = 8, 24, 10, 30, 28, 22,$

 $x_{18} = 4$, 12, 5, 15, 14, 11,

 $x_{24} = 2, 6, 18, 23, 7, 21,$

• The jump function $g^6(x) = 16x \mod 31$ generates:

1, 16, 8, 4, 2, 1, . . .

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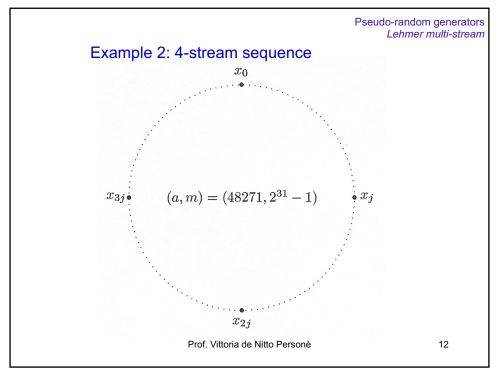
Using the jump function

- First, compute the jump multiplier $a^{j} \mod m$ (one time cost)
- Then, $g^j(\cdot)$ allows jumping from x_0 to x_j to x_{2j} to ...
- The user supplies ONE initial seed
- If j is chosen well, $g^{j}(\cdot)$ can "plant" additional initial seeds
- · Each planted seed corresponds to a different stream
- Each planted seed is separated by j calls to Random

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An appropriate jump multiplier

- Consider 256 = 28 different streams of random numbers
- Partition the RNG output sequence into 256 disjoint subsequences of equal length
- Find the largest $j < 2^{31}/2^8 = 2^{23}$ such that the jump multiplier is modulus-compatible
- $g^{j}(x) = \left(48271^{j} \mod m\right) x \mod m$ can be implemented via algorithm 1 (2.2.1 in the book)
- Then $g^{j}(x)$ can be used to plant the other 255 initial seeds
- Possibility of stream overlap is minimized (though not eliminated!)

Algorithm 1

```
 \begin{array}{ll} t = a * (x \% q) - r * (x / q); & /* t = \gamma(x) */ \\ \text{if (t > 0)} & \text{return (t);} & /* \delta(x) = 0 */ \\ \text{else} & \text{return (t + m);} & /* \delta(x) = 1 */ \end{array}
```

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Pseudo-random generators Lehmer multi-stream

Maximal Modulus-Compatible Jump Multipliers

 Maximal jump multiplier: maximize the distance between streams, ai mod m where j is the largest integer less than [m/s], s number of streams, such that ai mod m is modulus compatible

Example 2 (cont.)

# of streams s	_ 	jump size <i>j</i>	jump multiplier a ^j mod <i>m</i>
1024	2097151	2082675	97070
512	4194303	4170283	44857
256	8388607	8367782	22925
128	16777215	16775552	40509

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Library rngs

- · Upward-compatible multi-stream replacement for rng
- Provides 256 streams, indexed 0 to 255 (0 is the default)
- · Only one stream is active at any time
- 6 available functions:
 - Random(void): to use the standard Lehmer generator
 - PutSeed(long x): to set the state of the active stream
 - GetSeed(long *x): to obtain the state of the active stream
 - TestRandom(void): to test the implementation correctness
 - SelectStream(int s): to define the active stream
 - PlantSeeds(long x): "plants" one seed per stream

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