

case study:
machine shop model

Discrete-event simulation
Trace-driven simulation

Single server queue

Consider $n=10$ job and given arrival and service times:

Arrival times:
15 47 71 111 123 152 166 226 310 320

Service times:
43 36 34 30 38 40 31 29 36 30

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case study 2

Discrete-event simulation
Trace-driven simulation

A simple inventory system

i	1	2	3	4	5	6	7	8	9	10	11	12
d_i	30	15	25	15	45	30	25	15	20	35	20	30

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Random Number Generators

- ssq1 and sis1 require input data from an outside source
- The usefulness of these programs is limited by amount of available data:

- What if more data needed?
- What if the model changed?
- What if the input data set is small or unavailable?

Se ci servono più dati?
Se modello cambia?
Se ho pochi dati?

**Random number generator**

- It produces **real values** between 0.0 and 1.0 (Uniforme)
- The output can be converted to random variate via mathematical transformations (convertito in distr. di probabilità)

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Performance Modeling of Computer Systems and Networks

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Random Number Generators

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Random Number Generators

Historically there are three types of generators

- table look-up generators (1950)
- hardware generators
- algorithmic (software) generators

generator testabili
e controllabili, ma non
tutti sono validi! (C'è no!)

Algorithmic generators are widely accepted because they meet all of the following criteria:

- *randomness* - output passes all reasonable statistical tests of randomness
- *controllability* - able to reproduce output, if desired
- *portability* - able to produce the same output on a wide variety of computer systems
- *efficiency* - fast, minimal computer resource requirements
- *documentation* - theoretically analyzed and extensively tested

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Random Number Generators

Algorithmic Generators

- An *ideal* random number generator produces output such that each value in the interval $0.0 < u < 1.0$ is *equally likely to occur*
(numeri $R \in [0,1]$ sono ∞)
- A *good* random number generator produces output that is (almost) *statistically indistinguishable from an ideal generator*

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Conceptual Model

- Choose a *large* positive integer $m > 0$. This defines the set
 $\mathcal{X}_m = \{1, 2, \dots, m-1\}$
m numeri interi in un'urna
- Fill a (conceptual) urn with the elements of \mathcal{X}_m
- Each time a random number u is needed, draw an integer x "at random" from the urn and let $u = x/m \in [0, 1]$
- Each draw *simulates* a sample of an independent identically distributed sequence of $Uniform(0, 1)$
- The possible values are $1/m, 2/m, \dots, (m-1)/m$
- It is important that m be large so that the possible values are densely distributed between 0.0 and 1.0
insieme denso se m'è grande

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Conceptual Model

- 0.0 and 1.0 are impossible
 This is important for some random variates
- the same probability for each draw → replacement of the drawn element
- for practical reasons, we will draw without replacement
if m is large and the number of draws is small relative to m, then the distinction is largely irrelevant

Se estraggo 's', nella nuova estrazione lo rimetto. A livello software non posso "rimetterlo dentro"

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Lehmer Generator

- is defined in terms of two fixed parameters:
 - **modulus m** , a fixed large prime integer
 - **multiplier a** , a fixed integer in χ_m
- the possible values are $1/m, 2/m, \dots (m-1)/m$

The integer sequence x_0, x_1, \dots is defined by the iterative equation

$$x_{i+1} = g(x_i) \quad \text{genera numero a partire dal precedente!}$$

with

$$g(x) = ax \bmod m$$

$\xleftarrow{\text{moltiplicatore}} \quad \xrightarrow{\text{precedente estrazione}}$

$x_0 \in \chi_m$ is called **initial seed**

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- Because of the **mod operator**, $0 \leq g(x) < m$
- **0 must not occur**
 - since m is prime, $g(x) \neq 0$ if $x \in \chi_m$
 - if $x_0 \in \chi_m$, then $x_i \in \chi_m$ for all $i \geq 0$
- IF the multiplier and prime modulus are chosen properly, a Lehmer generator is statistically indistinguishable from drawing from χ_m with replacement
- NOTE, there is **nothing random about a Lehmer generator**

→ pseudo-random generator

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esempio: $m=7$, $\chi_7 = \{1, 2, 3, 4, 5, 6\}$. Scegli $a=3$, $x_0=1$ some. Genero, partendo da $g(x) = ax \bmod m$, i seguenti valori:
 $g(x_0) = 1 \cdot 3 \bmod 7 = 3 = x_1$; $g(x_1) = 3 \cdot 3 \bmod 7 = 2 = x_2$; $g(x_2) = 3 \cdot 2 \bmod 7 = 6 = x_3$; $g(x_3) = 3 \cdot 6 \bmod 7 = 4 = x_4$; cioè: 1 3 2 6 4 5 1, generati tutti
 • Se $x_0=3$? (DEVE appartenere a χ) genero: 3 2 6 4 5 1 3, cambia l'inizio, e basta! Quindi x_0 è irrilevante
 • Se $a=2$, $x_0=1$? genero 1 2 4 1, non sono tutti! **Rilevante!** $a=3$ è moltiplicatore **Full period** (ottimale)
 • Se $a=2$, $x_0=3$? genero 3 6 5 3, sottosequenza! **a ed m SONO IMPORTANTI**

Parameter Considerations

- the choice of m is dictated, in part, by system considerations
 - on a system with 32-bit 2's complement integer arithmetic, $2^{31}-1$ is a natural choice (it is prime!) $= m$
 - with 16-bit or 64-bit integer representation, the choice is not obvious (the maxes are not prime)
 - in general, we want to choose m to be the largest representable prime integer
- Given m , the choice of a must be made with great care
 - ↳ influisce sul periodo pieno

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- For a chosen (a, m) pair, does the function $g(\cdot)$ generate a **full-period** sequence?
- If a full period sequence is generated, how random does the sequence appear to be?
- Can $ax \bmod m$ be evaluated efficiently and correctly?
 - Integer overflow can occur when computing ax

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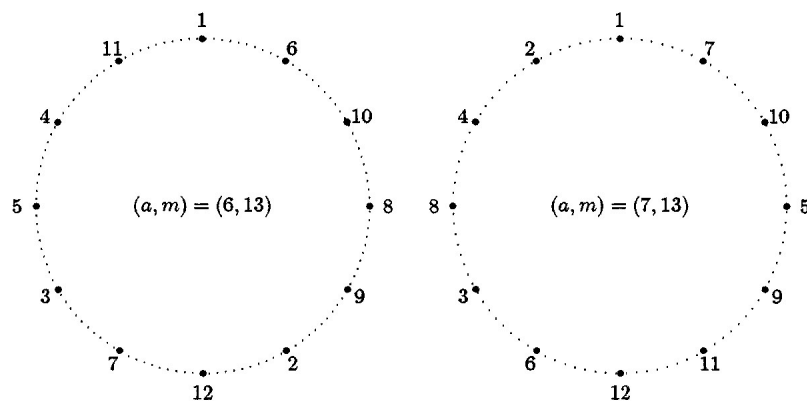
Full Period Multipliers

- da dove
parto
↓
- If we pick any initial seed $x_0 \in \chi_m$ and generate the sequence x_0, x_1, x_2, \dots then x_0 will occur again (x_0 ricompare dopo un po' di generazioni)
 - Further x_0 will reappear at index p that is either $m-1$ or a divisor of $m-1$
- $$p = \begin{cases} m-1 & \text{full period} \leftarrow \text{NOSTRO INTERESSE} \\ \text{divisore di } m-1 \end{cases}$$

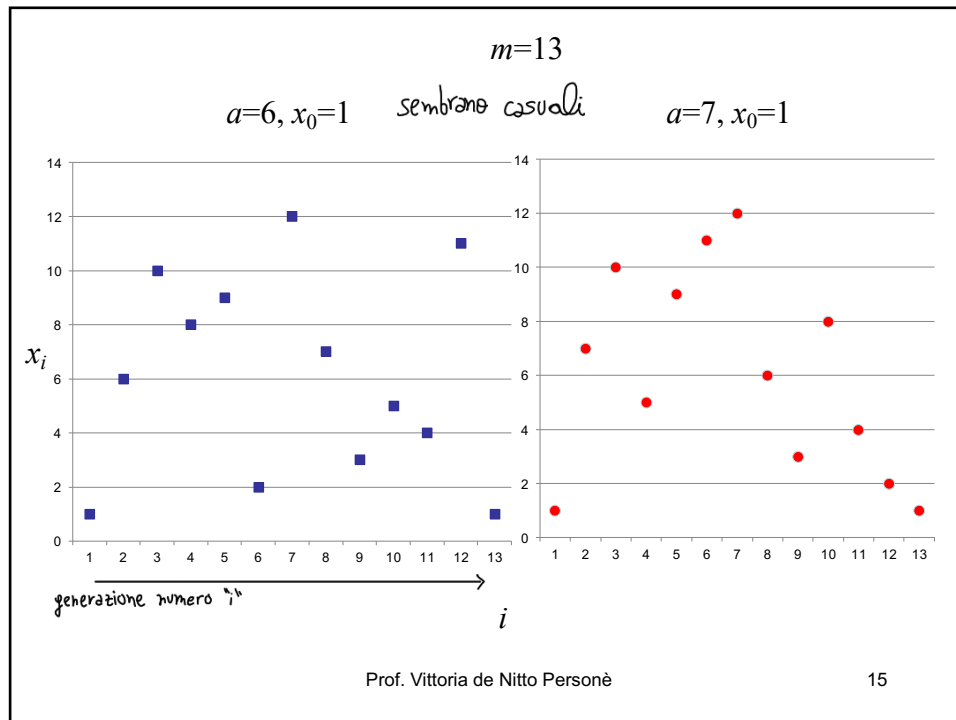
We are interested in choosing full-period (FP) multipliers
where $p = m-1$

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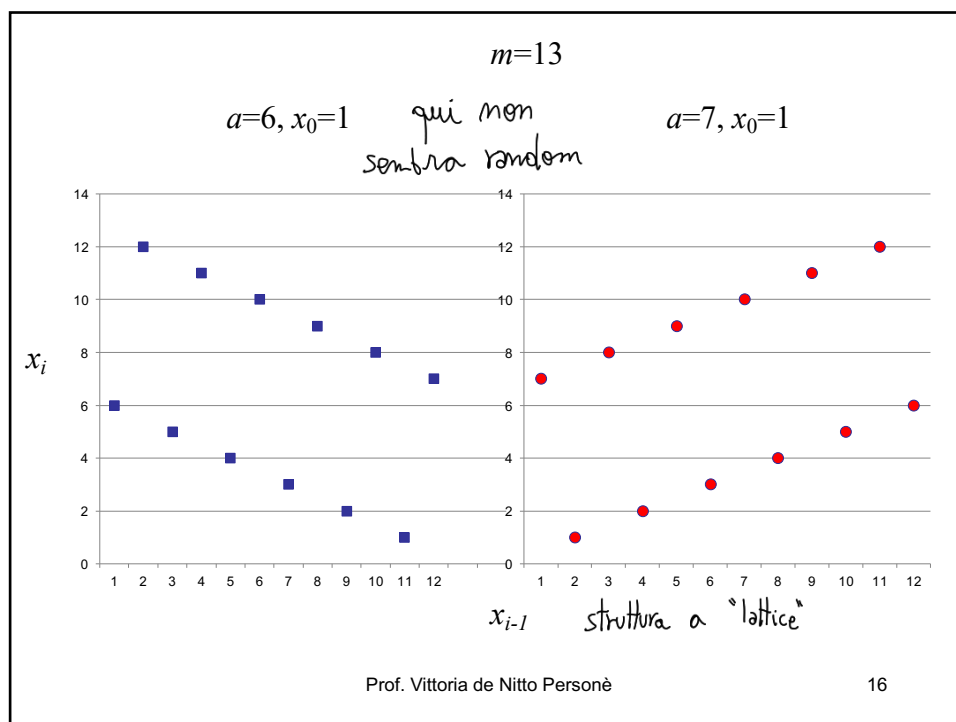
Full-period multipliers generate a virtual circular list with
 $m-1$ distinct elements.



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il grafico si legge così:

se $m = 13$ ho set $\{1, 2, 3, \dots, 12\}$, $a = 6$, $X_0 = 1$

computo: $g(X_{i-1}) = a * X_{i-1} = X_i$

$g(X_0) = 6 * 1 \bmod 13 = 6 = X_1$ (infatti X_1 creato a partire da X_0 , che è seed = 1)

$g(X_1) = 6 * 6 \bmod 13 = 10 = X_2$ (X_2 creato a partire da $X_1 = 6$)

$g(X_2) = 6 * 10 \bmod 13 = 8 = X_3$

Ora, per ogni $g(x)$ creo una coppia (X_{i-1}, X_i) , qui nell'esempio ho: (1,6), (6,10), (10,8). Li metto nel grafico ed ottengo tale struttura a lattice.

