

## 9.2 Simulations

# Simulations

- We think of a model as a set of equations describing what we observe in a real-world experiment.
- When we can't even do the experiment (e.g., nuclear testing), the model can be considered a **simulation**.

# Monte Carlo Simulations

A **Monte Carlo simulation** is a probabilistic model involving an element of chance.



# Genesis of Monte Carlo Simulations



John(ny) von  
Neumann  
(1903-1957)

- Game theory
- Quantum mechanics
- Economics
- Cellular automata
- Nuclear weapons
- Computer science (“von Neumann bottleneck”)

# (Pseudo)Random Numbers

- True randomness is rare (radioactive decay)
- In practice, we mimic randomness with a deterministic process
- **Linear congruential method** uses **modulus** (clock) arithmetic to generate a sequence  $r$  :

$$r_0 = 10$$

$$r_n = (7 r_{n-1} + 1) \bmod 11, \text{ for } n > 0$$

# Linear Congruential Method

- In general:

$$r_0 = \textit{seed}$$

$$r_n = (\textit{multiplier} * r_{n-1} + \textit{increment}) \bmod \textit{modulus}, \text{ for } n > 0$$

- Much research is devoted to methods for making these sequences difficult to predict (e.g., for codebreaking)
- Periodicity (length before repetition) should be as large as possible.

# Different Ranges of Random Numbers

- May want to restrict range of numbers, get floating-point values, etc.
- Modulus tells us the maximum integer we'll get. So we can divide by that max to get a floating-point value  $r$  in the interval  $[0,1]$ .
- We can then rescale to a new min, max:  
$$s = (max - min) * r + min$$