

Lecture 2

Cellular automata

28.10.2020

Definition

A **dynamical system** is a dynamic model that describes the evolution of a real-life system according to the specified rules.

example: evolutionary differential equations

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A **discrete dynamical system** - a dynamical system which operates in discrete time steps; it can be described as a set of numbers and rules of evolution in the following way:

$$\begin{array}{ll} X(t) = (x_1(t), \dots, x_n(t), \dots) & \text{state variables} \\ X(t+1) = F(X(t)) & \text{rules of evolution} \end{array} \quad (1)$$

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Cellular automaton

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Stephen Wolfram

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*A **cellular automaton** - a collection of cells arranged in a grid. Each cell admits one state in each moment t . The cells evolve according to the specified rules.*

cellular automaton: discretized time and space

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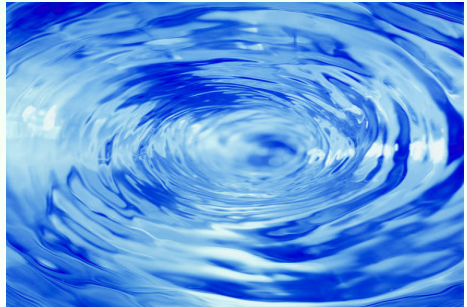
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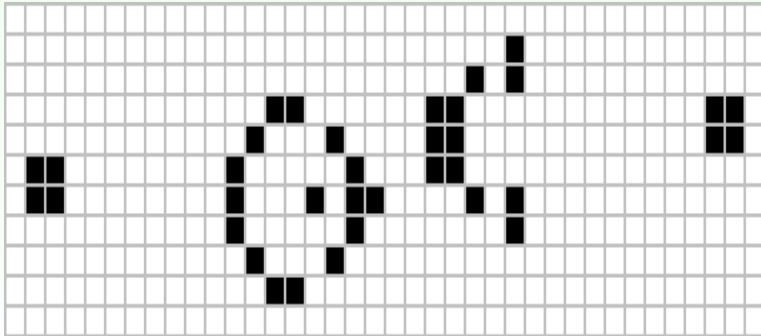
Cellular automata (CA) constitute a separate field of study.

1950s - **Stanisław Ulam**
and **John von Neumann**
applied CA to emulate
microscopic behaviour
of molecules in a fluid.



"The Game of Life"

The most popular CA - J.Conway's "Game of Life"
(a simple model of evolution of a colony of organisms).



Features of a cellular automaton

Cellular automata can differ by:

- number of states a cell can admit
- dimension and shape of a grid
- neighborhood of a cell
- boundary conditions
- rules of evolution (transition rules)
- initial configuration- configuration of the grid for $t = 0$ (initial generation).

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Transition rules

Transition rules are a function of

- cell state
- cell states in the neighborhood

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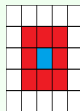
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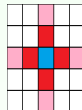
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Popular neighborhoods for a 2D rectangular grid

- Moore's neighborhood

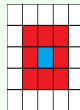


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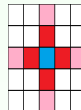


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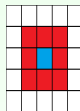


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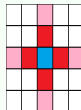


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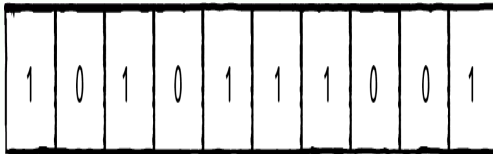


Elementary cellular automaton

Comprehensive studies regarding CA have been performed by S.Wolfram (creator of "Mathematica" application) starting from 1980s and resulted in a book "**A New Kind of Science**" (Wolfram, 2002).

Definition

Elementary cellular automaton is a one-dimensional binary (2-state) nearest-neighbor automaton.

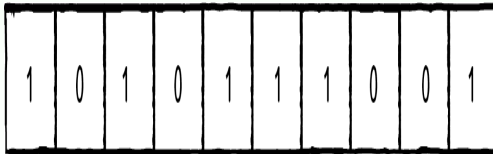


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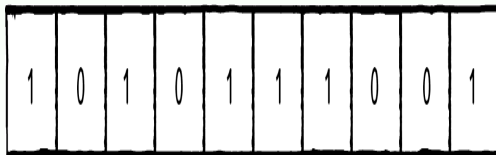


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Wolfram's codes of elementary CA

Two states (0-white 1-black), **2-cell** neighborhood.

There are $8 = 2^3$ possible configurations of a neighborhood of the cell

111 110 101 100 011 010 001 000

Each of them can result in 2 possible states of the middle cell in the next generation, so there are

$$2^{2^3} = 256$$

different rules.

A rule $d_7 d_6 d_5 d_4 d_3 d_2 d_1 d_0$ in a binary code ($d_0, \dots, d_7 \in \{0, 1\}$) is transformed into its decimal representation (Rule#k):

$$k = d_7 2^7 + \dots + d_1 2^1 + d_0 2^0.$$

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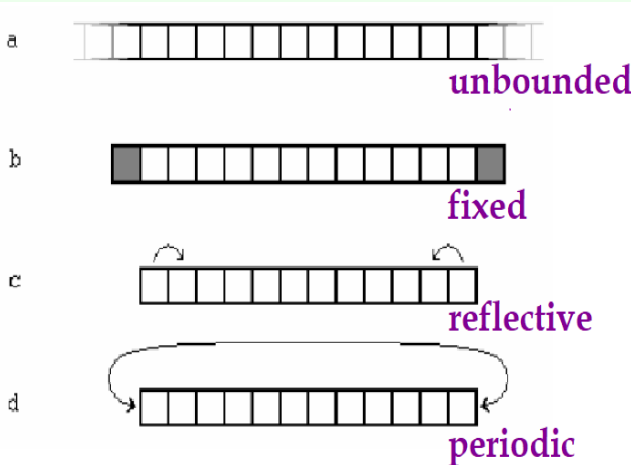
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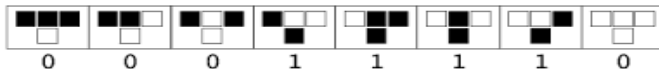
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Different boundary conditions for elementary CA

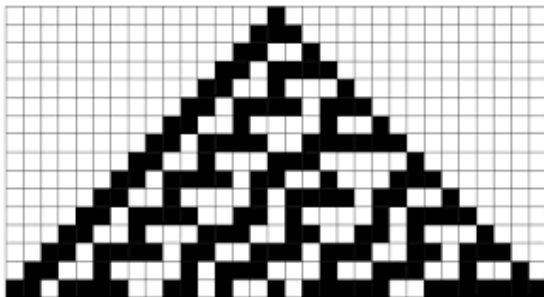


"Rule 30", spatio-temporal plot

Example of a cellular automaton: "rule 30"



Evolution starting from 1 black cell:



CA can generate random numbers

Although CA are deterministic, some of them have suitable properties for generating random numbers.

"Rule 30" has been used as a pseudorandom number generator in "Mathematica".

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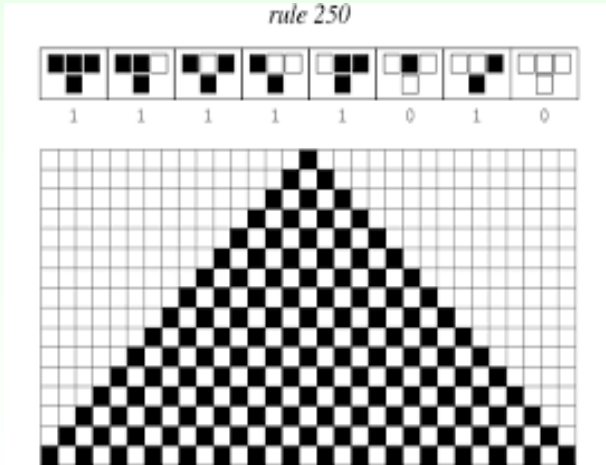
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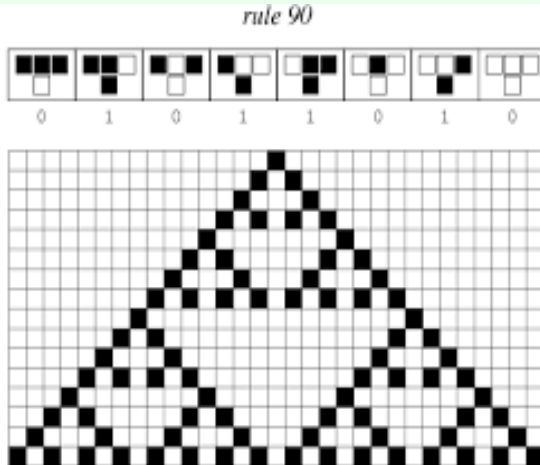
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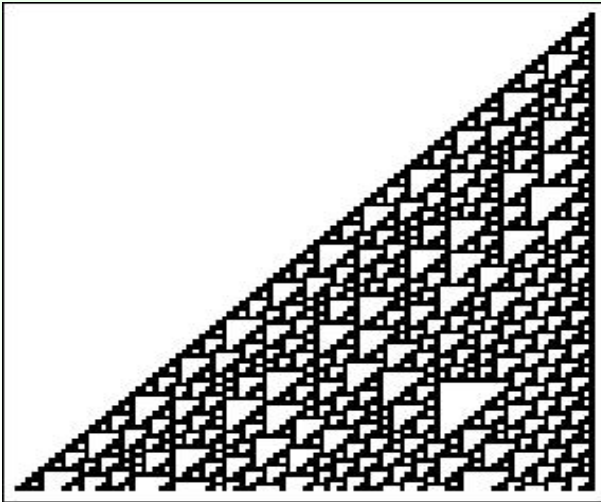
"Rule 250", spatio-temporal plot



"Rule 90", spatio-temporal plot



"Rule 110", spatio-temporal plot



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***Totalistic cellular automaton** - its rules depend only on the total (or - equivalently - the average) of the values of the cell and its neighbors.*

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One dimensional totalistic automaton

For a (one-dimensional, nearest neighbor) k -state totalistic automaton there are $3k - 2$ possible values of the total of three cells.

This gives k^{3k-2} different rules.

Thus each rule can be indexed by an $3k - 2$ -digit k -ary number.

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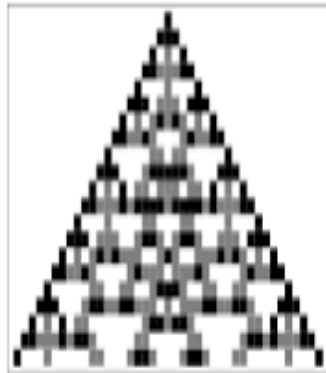
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3-state 1-dimensional totalistic automaton: code777

code 777



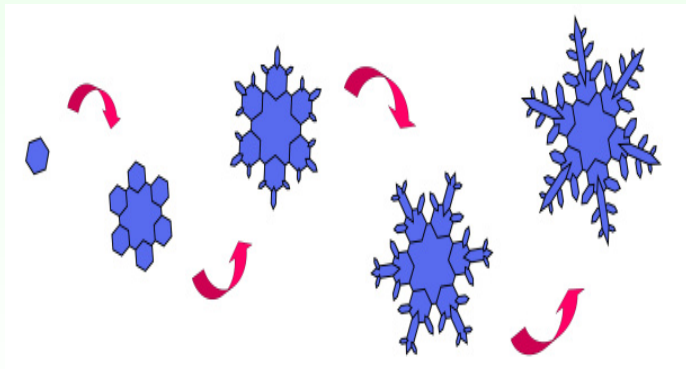
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Applications of CA

Cellular automata model a great variety of phenomena, like

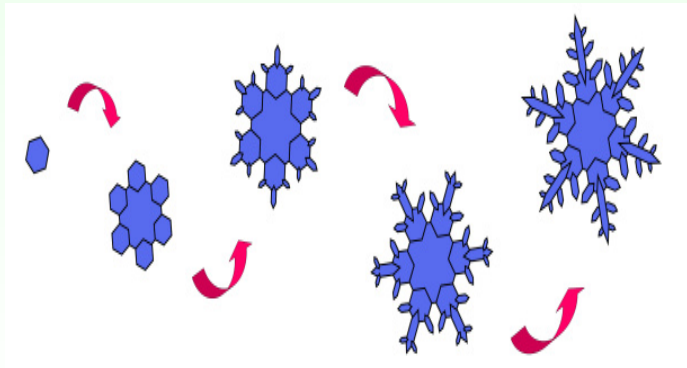
- crystal growth

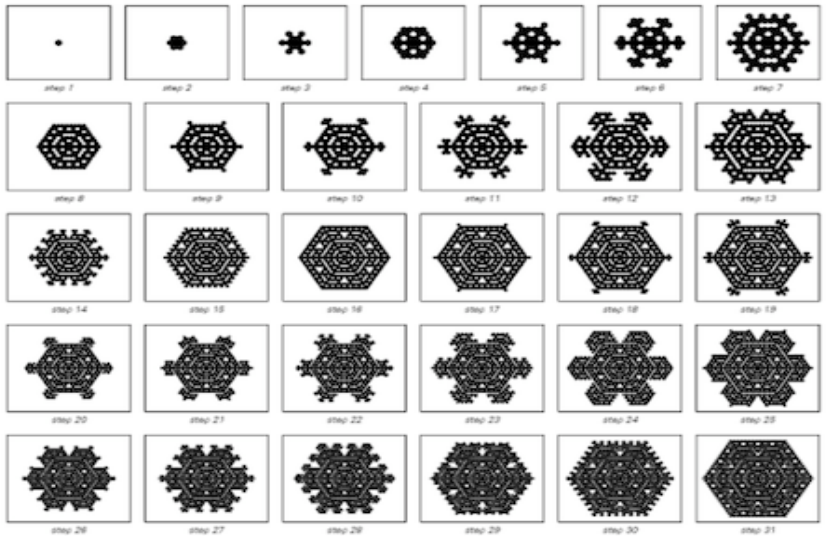


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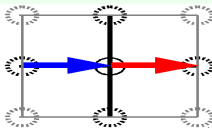
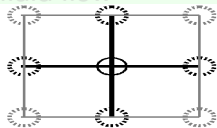
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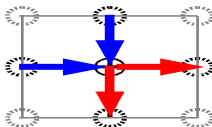
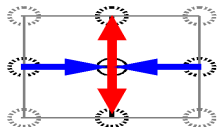



Some applications of CA


● fluid flow

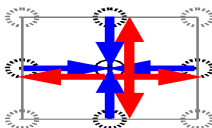
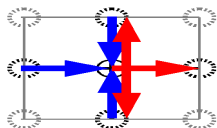


each cell has 4 attributes:
 right
 left
 up
 down
 } 2 states



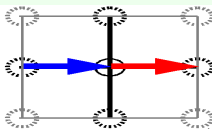
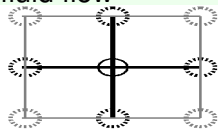
blue arrow: state "1" of "right" attribute of the cell  (generation n)

red arrow: state "1" of "right" attribute of the right-hand side neighbor  (generation $n+1$)

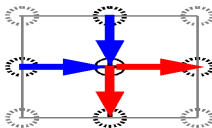
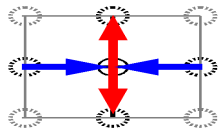


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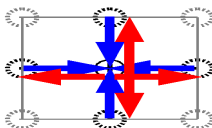
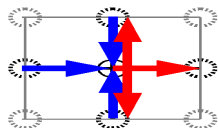
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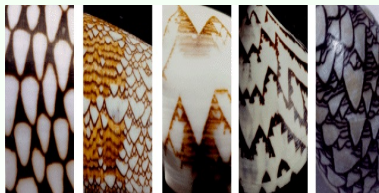
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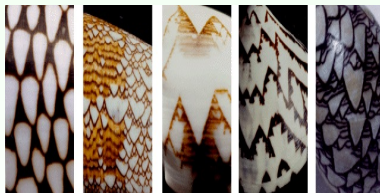
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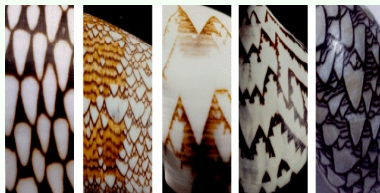
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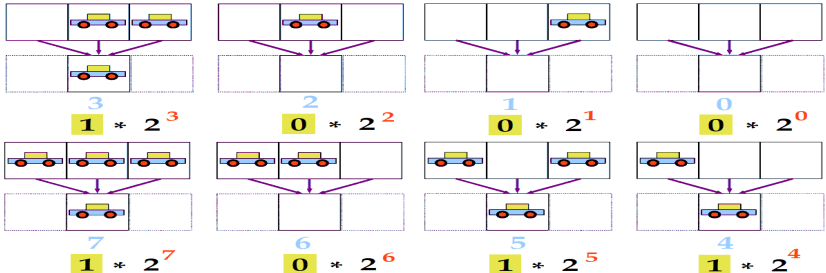


Rule 184

● traffic jams

Simplifying assumptions:

- automobiles are placed in a single lane of traffic
- they move to the right
- in each unit of time each car either moves to the right-hand side cell or stays in the current cell
- a car moves only if the right-hand side cell is empty

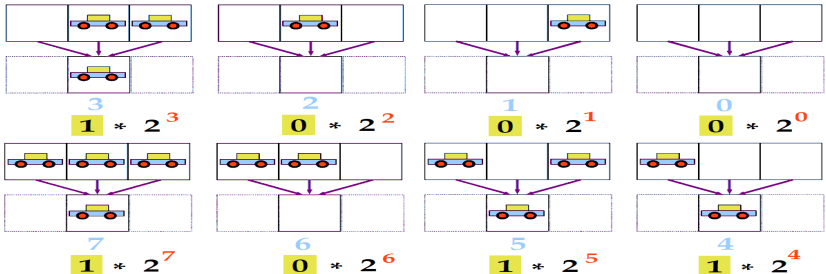


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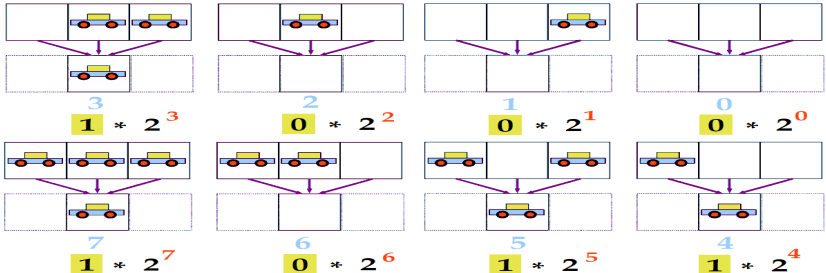


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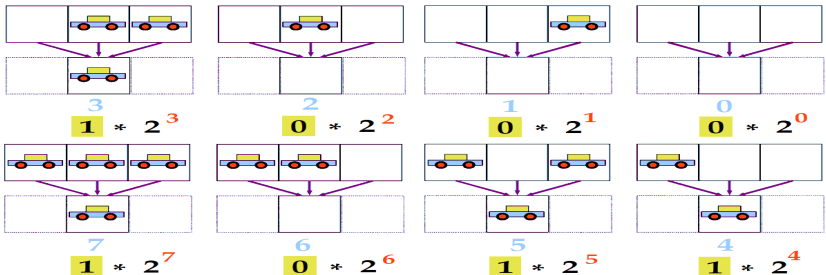


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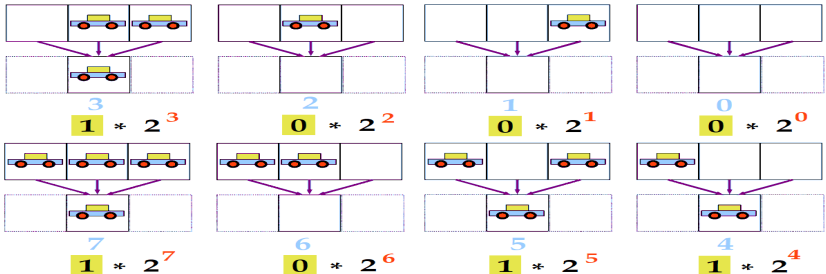


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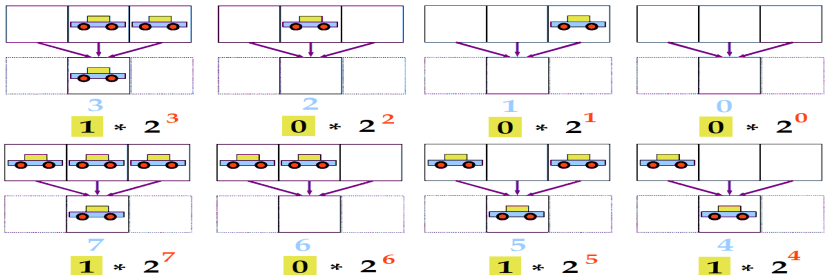


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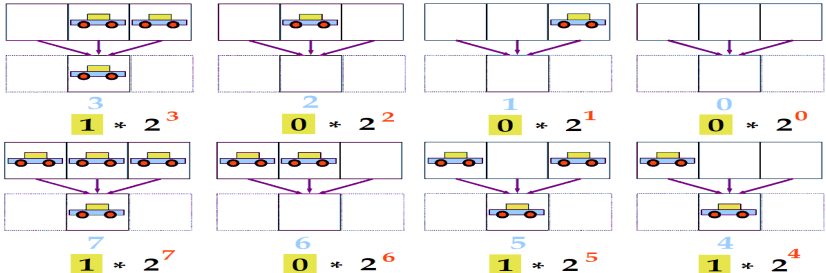


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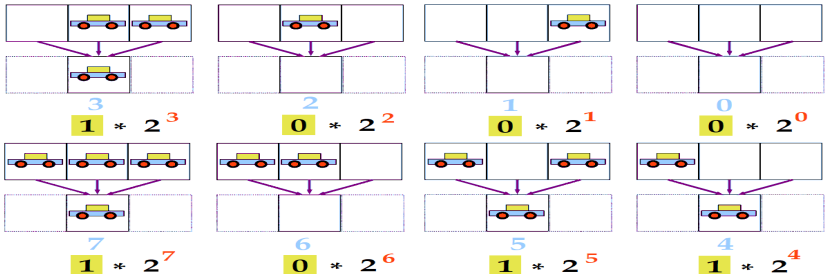


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- forest fire spread
- disease spread in a population
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