
Computer Simulations

A practical approach to simulation

Semra Gündüç

`gunduc@ankara.edu.tr`

Ankara University Faculty of Engineering,

Department of Computer Engineering

Cellular Automata

Cellular Automata

Cellular Automata

Introduction to Cellular Automata

- Cellular automata provide a fascinating class of dynamical systems based on very simple rules of evolution yet capable of displaying highly complex behavior.
- S. Wolfram, “A New Kind of Science”, (Wolfram Research Europe 2002)
<https://www.wolframscience.com>
- S. Wolfram, editor, Theory and Applications of Cellular Automata (World Scientific, Singapore, 1986).
- T. Toffoli and N. Margolus, Cellular Automata Machines (MIT Press, 1987).

Cellular Automata

Introduction to Cellular Automata

- Cellular automaton refers to the dynamics of a collection of cells.
- Each one of these cells can be in one of the finite set of states.
- The time evolution is discrete,
- At each step, the new value for a cell depends only on the current state of itself and its neighbors.

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Introduction to Cellular Automata

- These systems are fascinating in that deceptively simple rules can give rise to extremely complex behavior.
- Even though the formulation of a cellular automaton may seem almost trivial, there are a huge number of possible rules.
- Furthermore, slight changes in the rules can dramatically change their behavior.

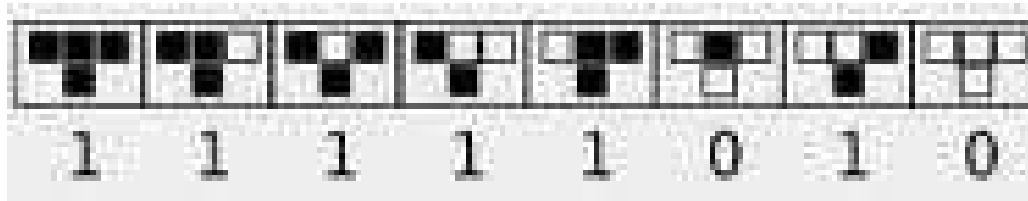
Cellular Automata

Introduction to Cellular Automata **Example:**

- Consider one dimensional models where each cell can take only one of two possible states.
- Each cell has two neighbours,
- The evolution of a given cell to the next time step depends only on the current values of the cell and each of its two neighbors
- In this case there are $2^3 = 8$ possible arrangements for the cell and its neighbors.
- Since the cell can take only two values 0 or 1 (“dead” or “alive”) for each one of these 8 possible arrangements, $2^8 = 256$ rules exist even for this most simple model.

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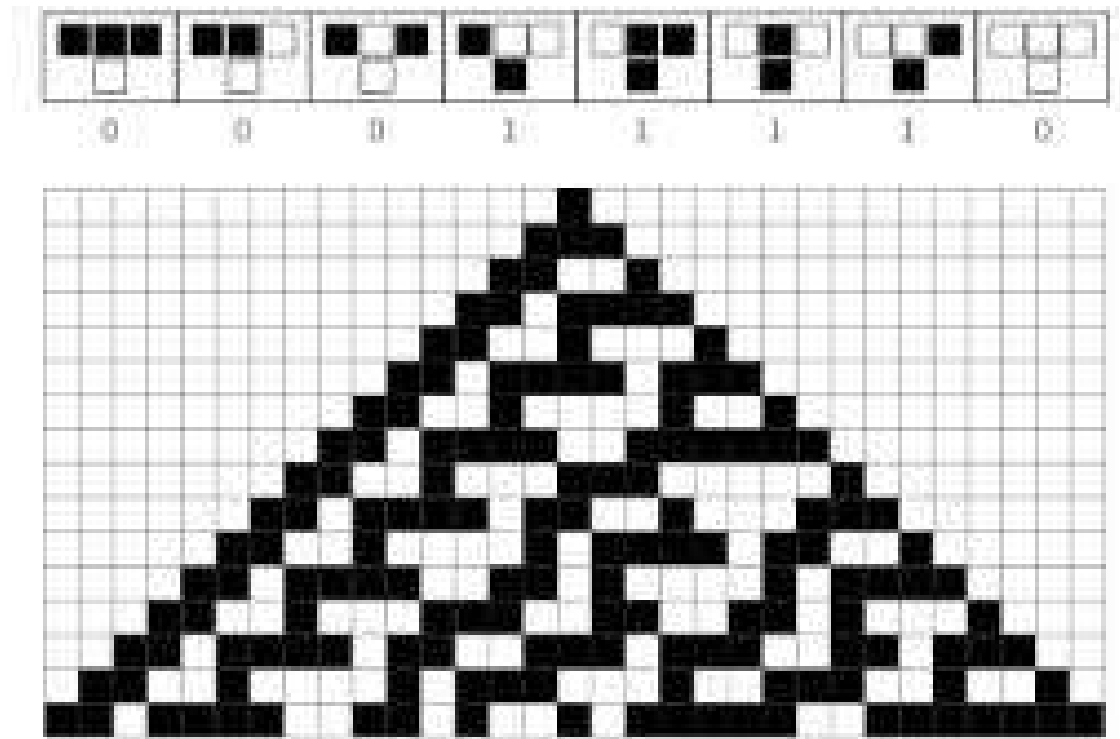


$$\text{Rule 150} = 1 \times 2^7 + 1 \times 2^6 + 1 \times 2^5 + 1 \times 2^4 + 1 \times 2^3 + 0 \times 2^2 + 1 \times 2^1 + 0 \times 2^0$$

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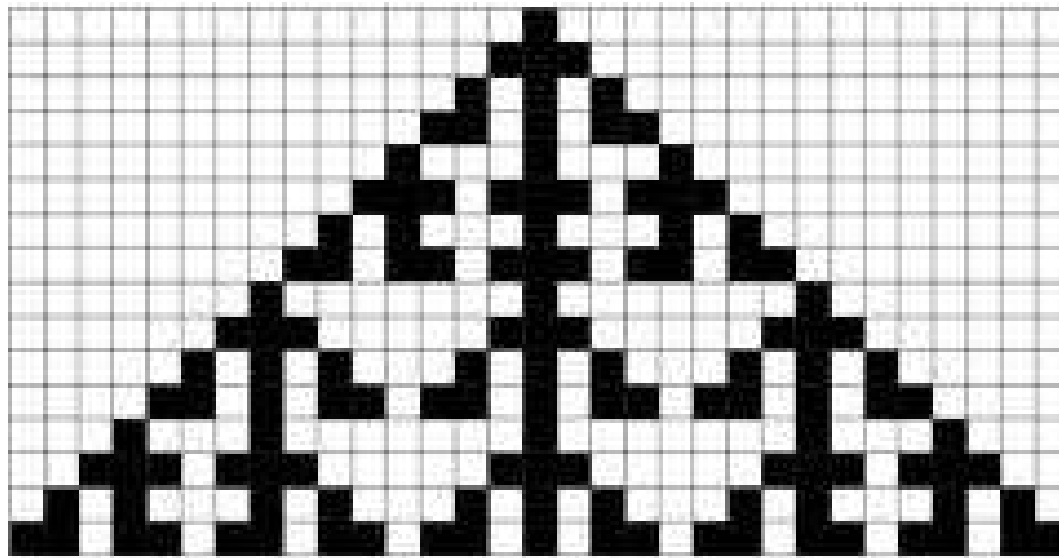
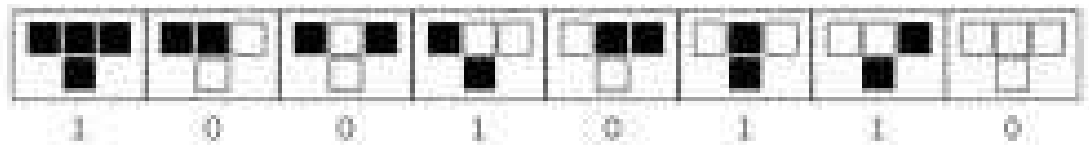
rule 30



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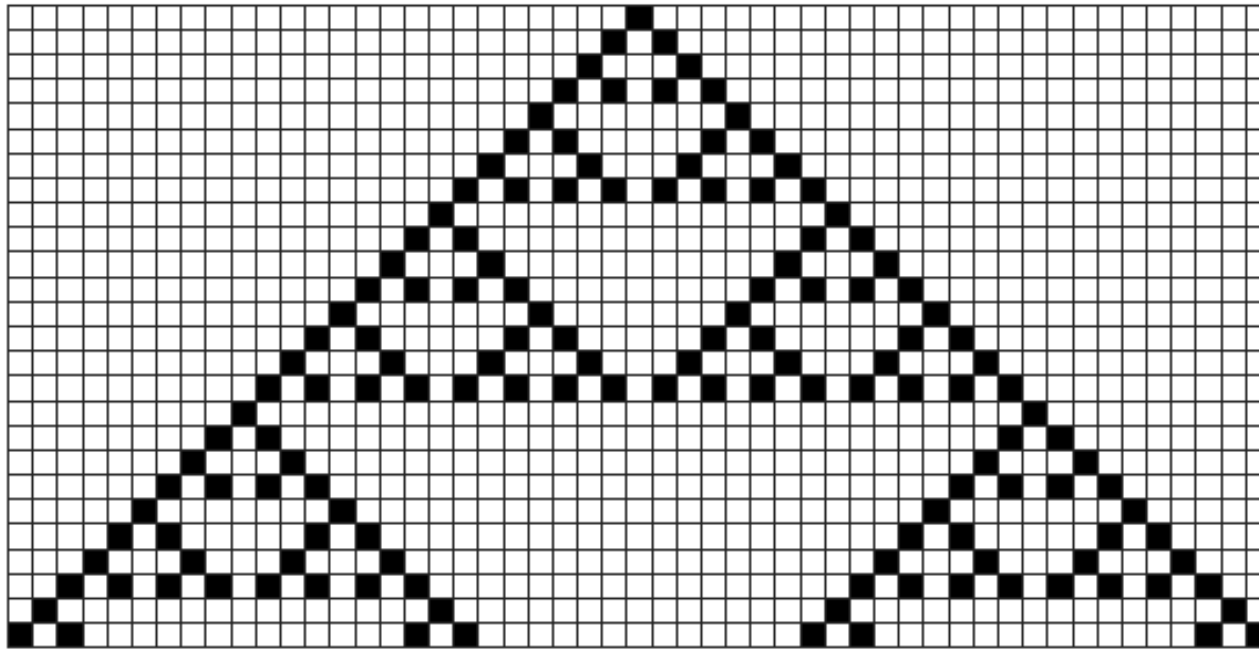
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rule 150



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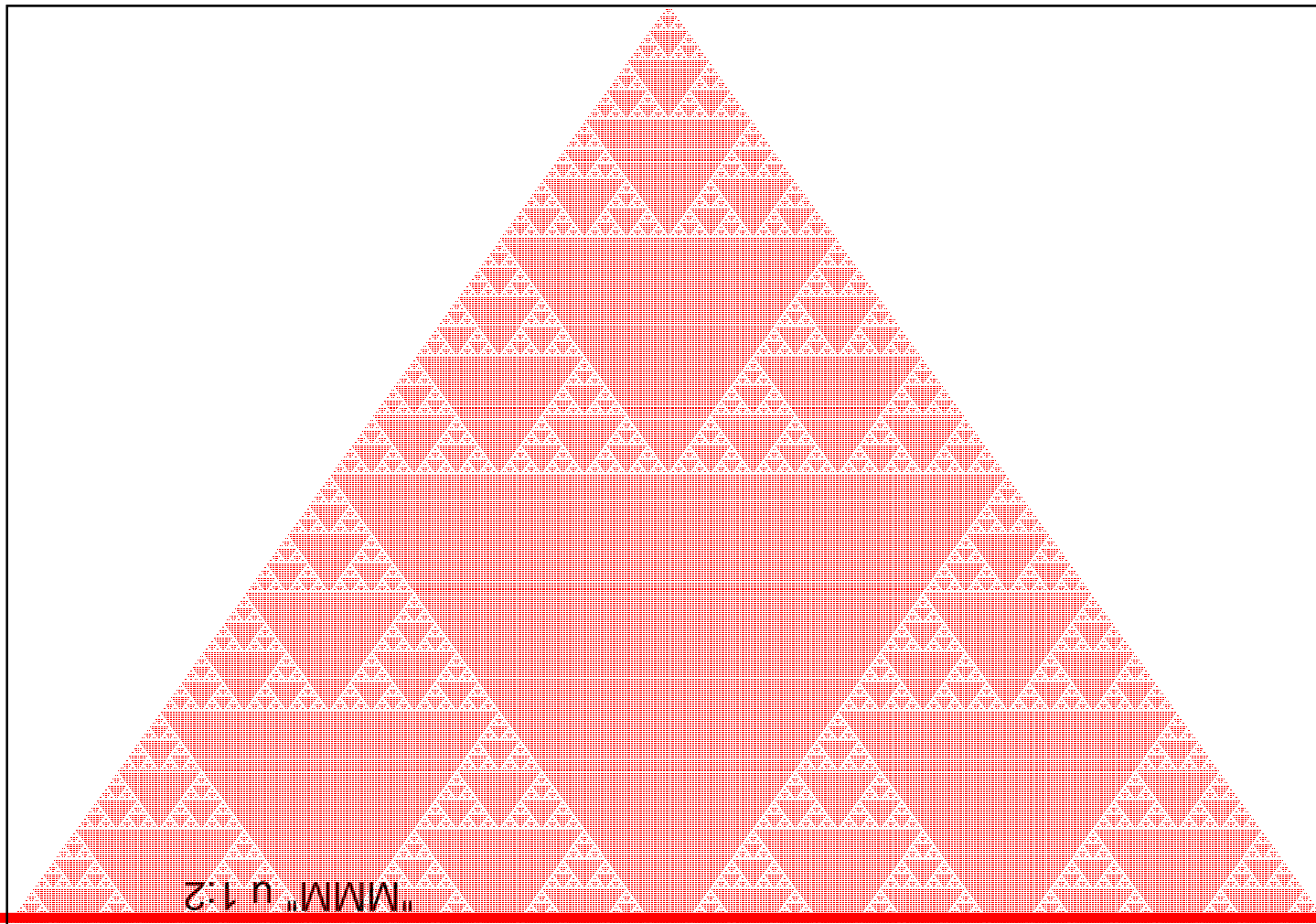


Rule 90 :

$0 \rightarrow 0; 1 \rightarrow 1; 2 \rightarrow 0; 3 \rightarrow 1; 4 \rightarrow 1; 5 \rightarrow 0; 6 \rightarrow 0; 7 \rightarrow 0$

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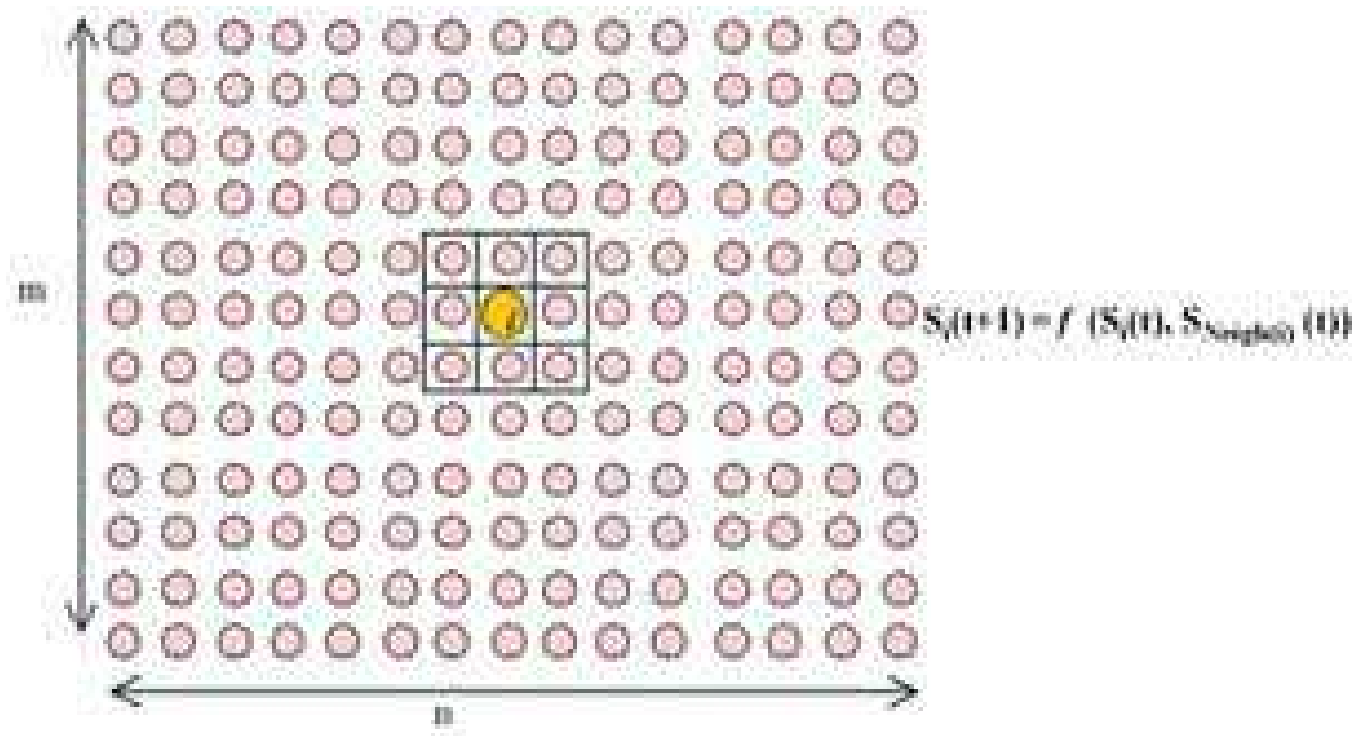
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Example:

- If a two dimensional model is assumed, then the number of cells are 9,
- considering cells with only two states possible arrangements are: $2^9 = 512$
- A general rule needs to specify the next state of the cell for each of these arrangements. This gives $2^{512} = 1.3 \times 10^{154}$ possible rules.
- compare this with the approximate age of the universe ($\sim 4 \times 10^{17}$ seconds)

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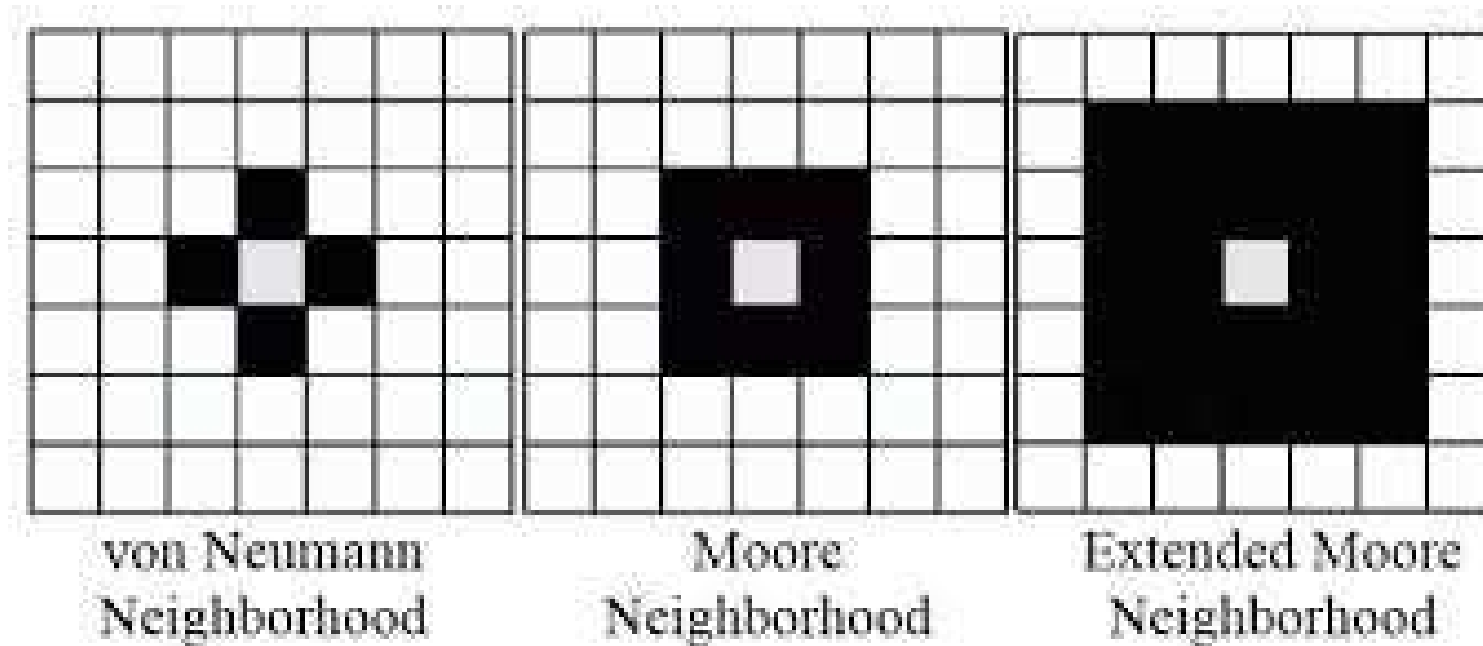
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Eight neighbours of the cell in two dimension.

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- If it is restricted, next state of the cell depends on the total of only the four nearest neighbors, then there are $2^{10} = 1024$ possible rules to consider.
- With a discrete set of states, cellular automata have the appealing feature of being easily implementable entirely by logical operations, the natural functions of computer circuitry
- Also, the state of several cells can be stored and manipulated within a single computer word

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- Using such tricks, these models can often be implemented to run extremely fast.
- Such models may supply simulation methods as good as or better than the conventional use of floating point fields on a discrete grid.
- With this motivation, considerable attention has been paid to cellular automata.
- Another advantage of this approach is the ability to work with arbitrary boundary conditions.

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Conway's Life

- Perhaps the most famous cellular automaton model is Conway's "Game of Life"
- E. Berlekamp, J. Conway, and R. Guy, *Winning Ways for your Mathematical Plays*, volume 2, (Academic Press, ISBN 0-12-091152-3, 1982) chapter 25.

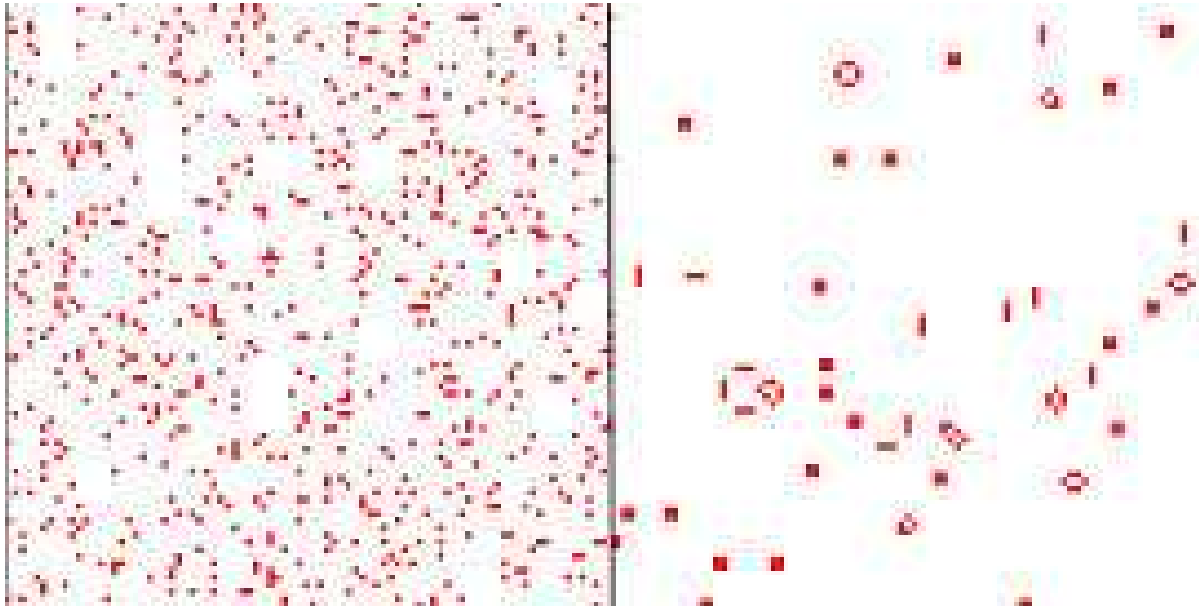
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Conway's Life

- The rule involves the eight cell neighborhood,
- if a cell is initially “dead” it becomes alive
 - if and only if it has exactly three live neighbors,
 - or “parents.”
- A living cell dies
 - of loneliness if it has less than two live neighbors,
 - and of overcrowding if it has more than three live neighbors.
- Only in the case of exactly two or three live neighbors does it survive.

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Living structures starting from a random initial state.

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Conway's Life

Project:

- A particularly amusing local configuration has five live cells (1's at the coordinates given below);
- Starting with coordinates $\{(0, 0), (0, 1), (0, 2), (1, 2), (2, 1)\}$.
- After four time steps this configuration returns to its original shape, but displaced by $(-1, 1)$.
- On an otherwise empty board, this "glider" continues to propagate as a single entity.

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Conway's Life

- A large collection of fascinating life configurations can be found in the Wikipedia
- See Wikipedia, "Conway's Game of Life," [http://en.wikipedia.org/wiki/Conway's life](http://en.wikipedia.org/wiki/Conway's_life)

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Conway's Life

- Gliders allow information to be propagated over long distances,
- It has been proven that with a complicated enough initial configuration, one can construct a computer out of live cells on a life board.
- Special subconfigurations form the analog of electronic gates, which can control beams of gliders representing bits.
- Indeed, since life is capable of universal computation, one might imagine a life board programmed to simulate the game of life

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Fredkin's modulo-two rule

- An extremely simple but highly amusing rule takes at each time step the “exclusive or” (XOR) operation between a site and its neighbors.
- This rule has the remarkable property of self replication.
- M. Gardner, *Wheels, Life, and Other Mathematical Amusements* (W. H. Freeman and Company, New York, 1983).

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Fredkin's modulo-two rule

- Starting with any given initial pattern, after 2^n time steps copies of the original state occupy positions separated by 2^n spatial sites from the original in every direction as specified in the chosen neighborhood.

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Forest fire simulation- A cellular automata application

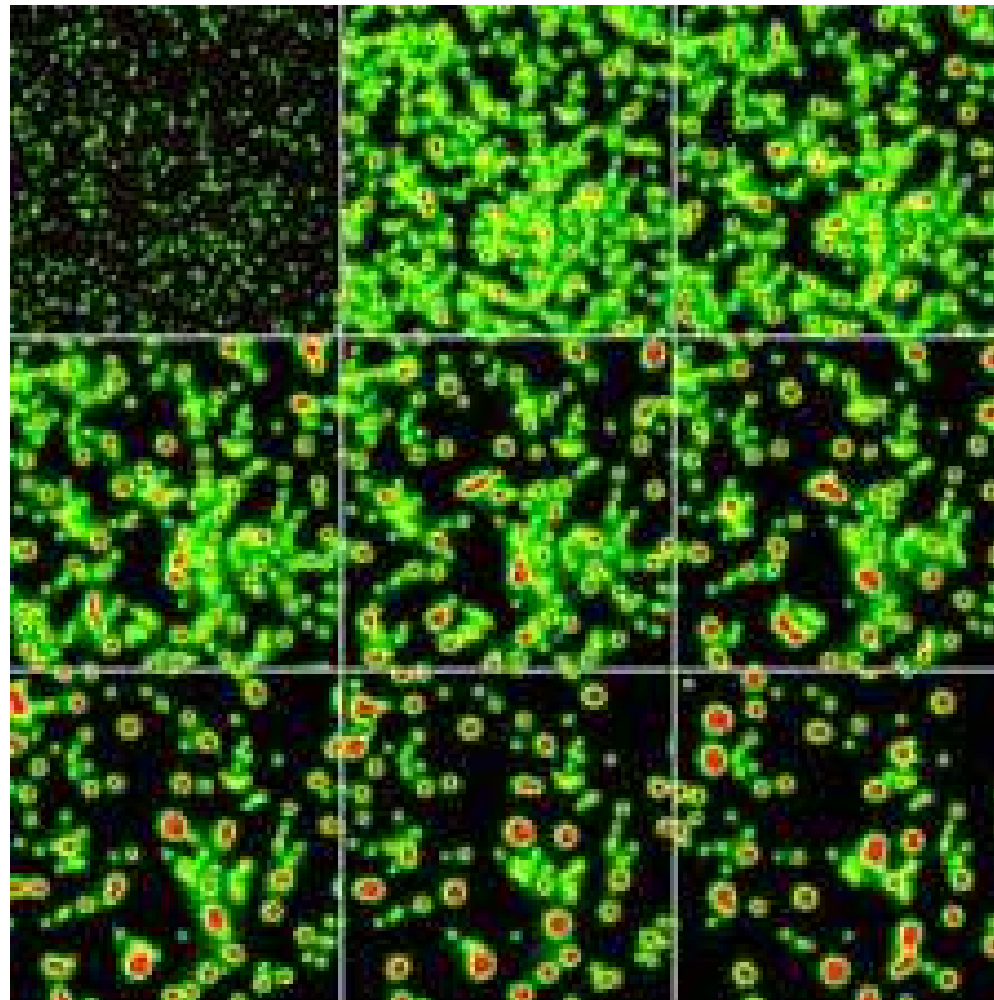
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Forest Fires

- An amusing model of forest fires:
- Each cell has three possible states, (empty(0), a tree (1), or a fire (2)).
- On a finite system, one should,
 - randomly fill the lattice with empty spaces and trees.
 - light a fire somewhere to get the system started.
- For the updating step,
 - Any empty site can have a tree born with a small probability.
 - Any existing fire spreads to neighboring trees leaving its own cell empty.

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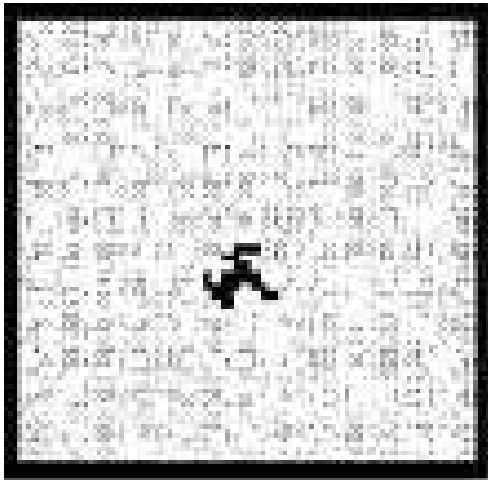
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Forest Fires

- The rule here differs from those discussed previously in having a stochastic nature.
- As the system is made larger, the growth rate for the trees should decrease to just enough to keep the fires going.
- If too many trees grow, one obtains a large fire reducing their density, while if there are too few trees, fires die out.

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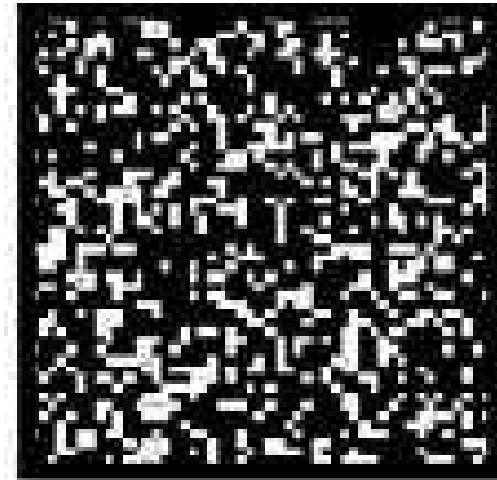
Forest Fires



Sub-critical



Critical



Super-critical

Forest fire simulation- Criticality

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Forest Fires

- As the system becomes larger, the growth rate for the trees can be reduced without the fire expiring.
- In a steady state the system has fire fronts continually passing through the system,
- Perhaps there is a moral here that one should be careful about extinguishing all fires in the real world, for this may enhance the possibility for a catastrophic uncontrollable fire.

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Sand Pile Model



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Sand Pile Model

- For a review of this and several related models, see
- S. Clar, B. Drossel, and F. Schwabl, J. Phys.:Cond. Mat. 8, 6803 (1996).

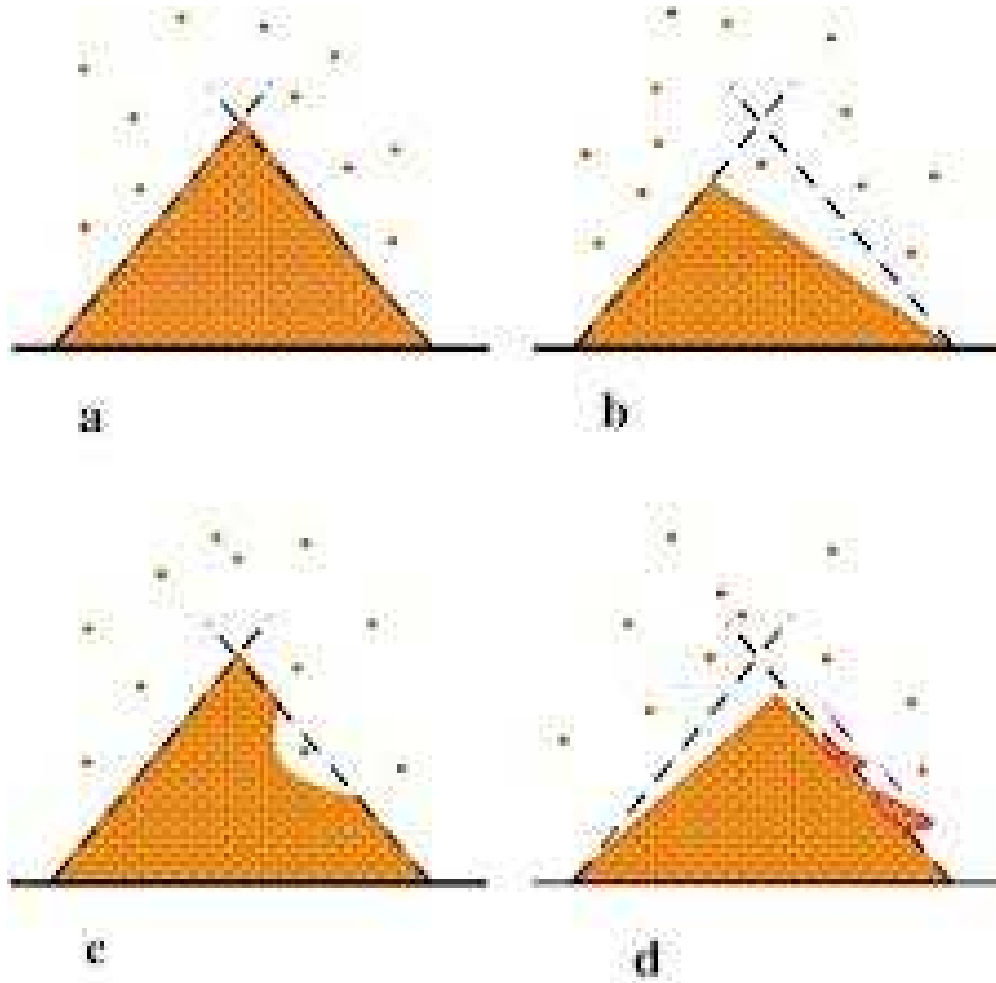
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Sand Pile Model **The phenomenon of sandpile**

- On slowly adding grains of sand to an empty table, a pile will grow until its slope becomes critical and avalanches start spilling over the sides.
- If the slope becomes too large, a large catastrophic avalanche is likely, and the slope will reduce.
- If the slope is too small, then the sand will accumulate to make the pile steeper.
- Ultimately one should obtain avalanches of all sizes, with the prediction of the size for the next avalanche being impossible to determine without actually running the experiment.

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Sand Pile Model



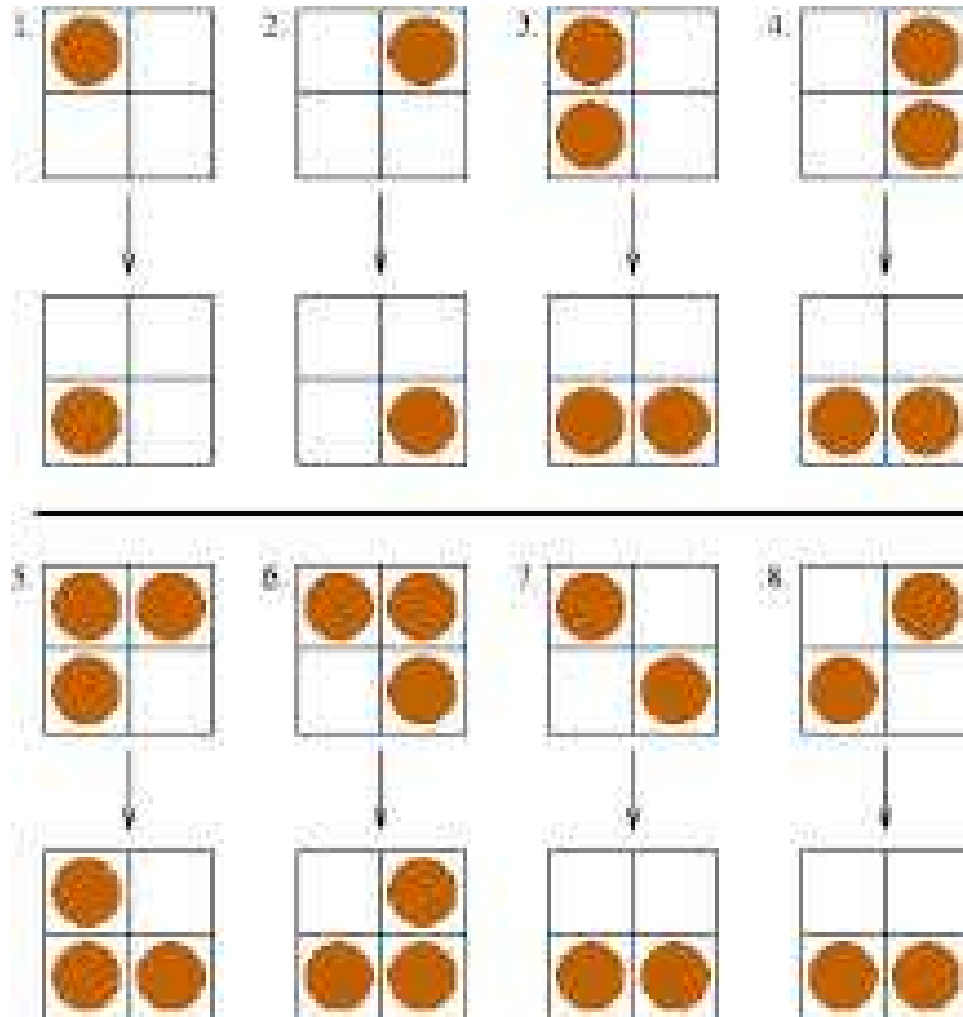
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Sand Pile Model

- The original Bak, Tang, Wiesenfeld paper [1] presented a particularly simple model to mimic the sandpile idea.
- For this, each site of a two dimensional lattice has a state represented by a positive integer z_i .
- This integer can be thought of as representing the amount of sand at that location, or in another sense it represents the slope of the sandpile at that point.
- P. Bak, C. Tang, and K. Wiesenfeld, Phys. Rev. Lett. 59, 381 (1987); Phys. Rev. A38, 3645 (1988).

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Sand Pile Model



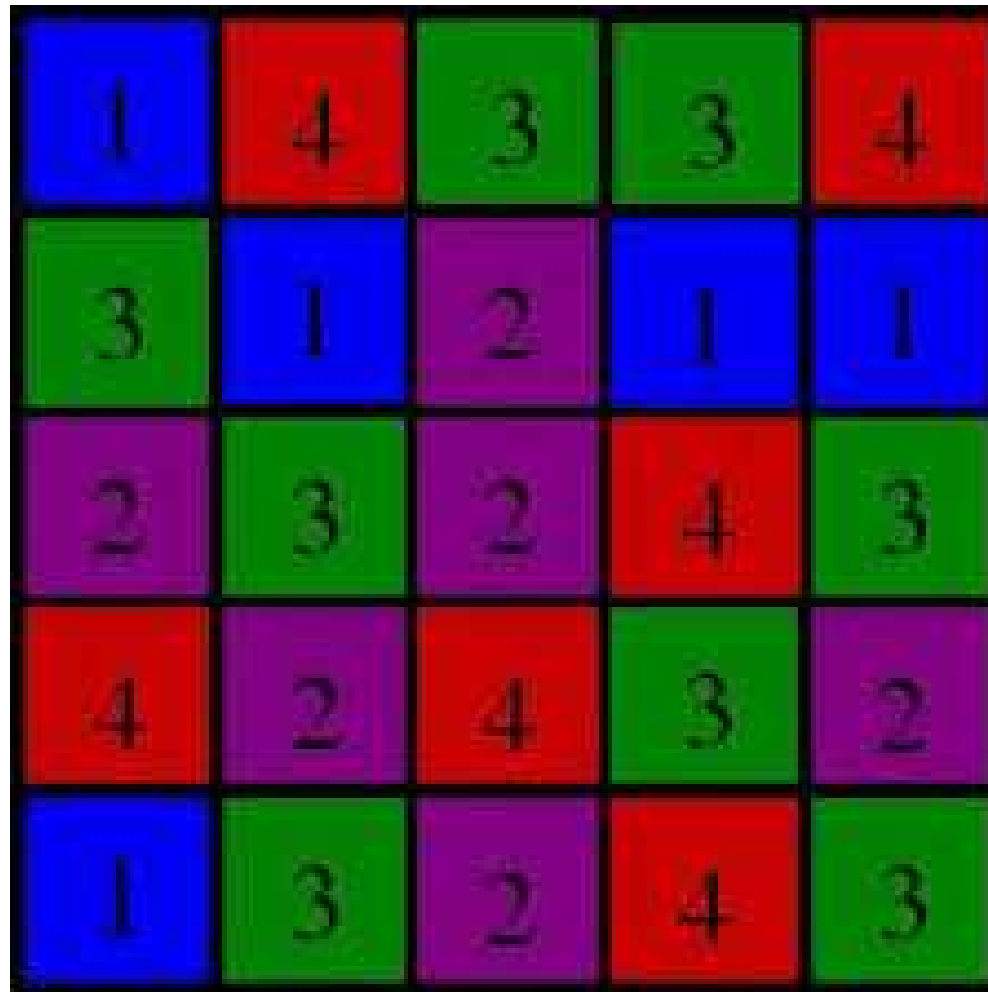
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Sand Pile Model

- The dynamics follows by setting a threshold z_T above which any given z_i is unstable.
- Time now proceeds in discrete steps. In one such step each unstable site with $z_i \geq z_T$ “tumbles” or “topples”, dropping by z_T and adding one grain to each of its four nearest neighbors.
- This may produce other unstable sites, and thus an avalanche can ensue.
- This proceeds for further time steps until all sites are stable.

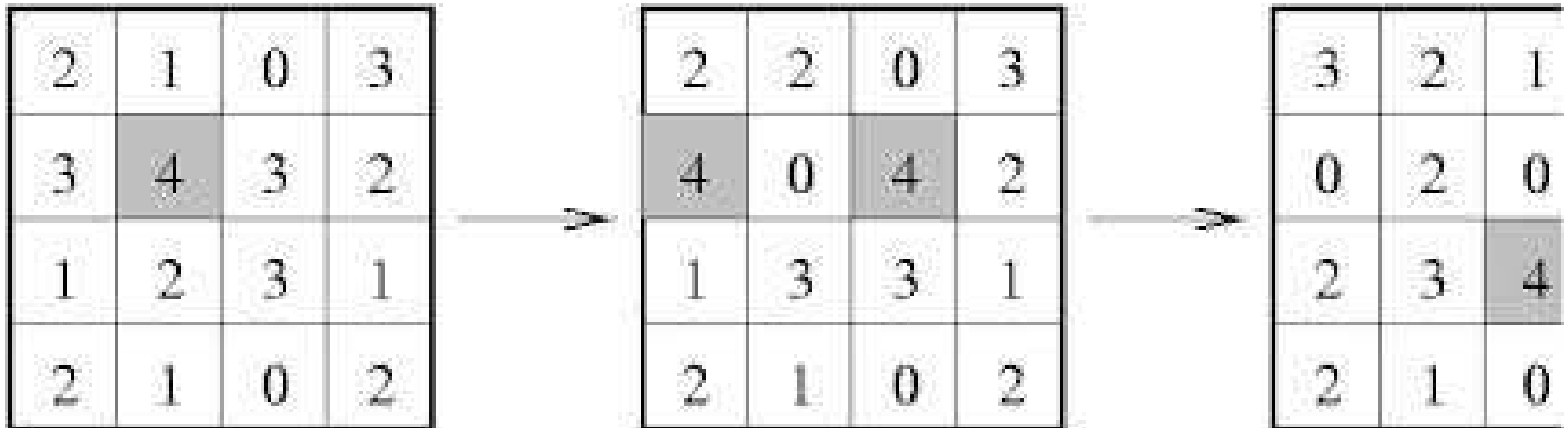
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Sand Pile Model



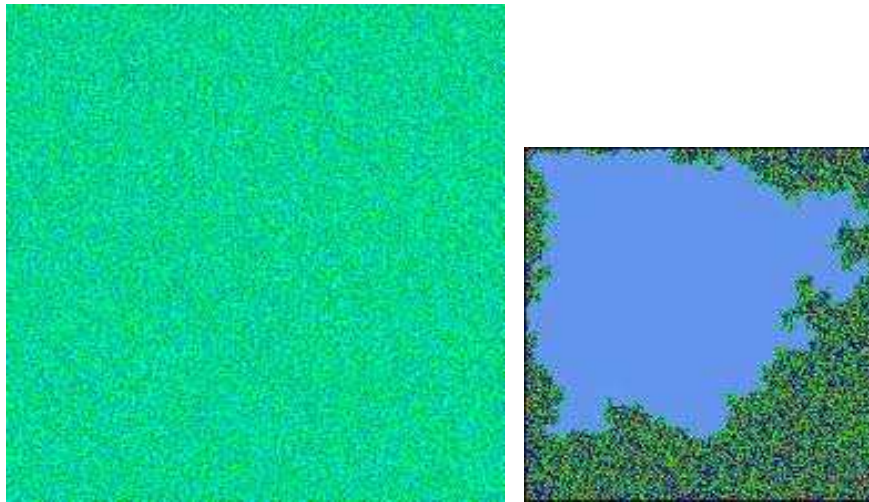
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Sand Pile Model



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Sand Pile Model



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Sand Pile Model

A natural experiment consists of,

- adding a grain of sand to a random site
- measuring the number of topplings and the number of time steps for the resulting avalanche.
- Repeating this many times to gain statistics,
- the distribution of avalanche sizes and lengths displays a power law behavior, with all sizes appearing