

CITS4403 – April 24, 2013

# Modelling Complex Systems

## Cellular Automata (Part I)

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# Overview

- CA: History & Introduction
  - von Neumann, self-replication
  - Conway's Game of Life
  - Modelling physical systems. Some examples
- CA: Formal definition
- Brownian motion, temperature, random walk, diffusion

# CA: History & Introduction

John von Neumann  
(1903-1957)

- Late 40s: involved in design of first digital computers
- Self-reproducing systems
- Seminal work for CA:

*Theory of self-reproducing Automata,*  
John von Neumann,

edited and completed by Arthur W. Burks  
University of Illinois Press, Urbana and London, 1966

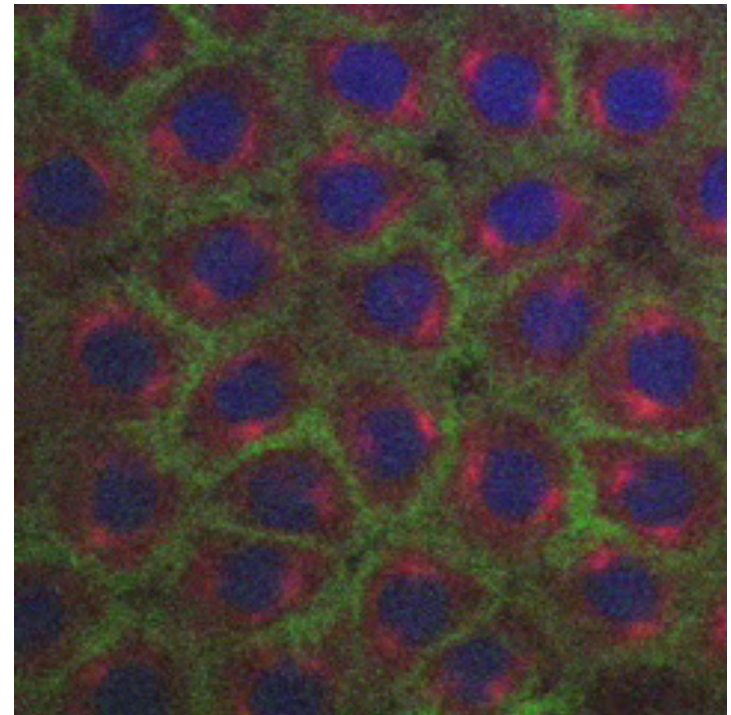
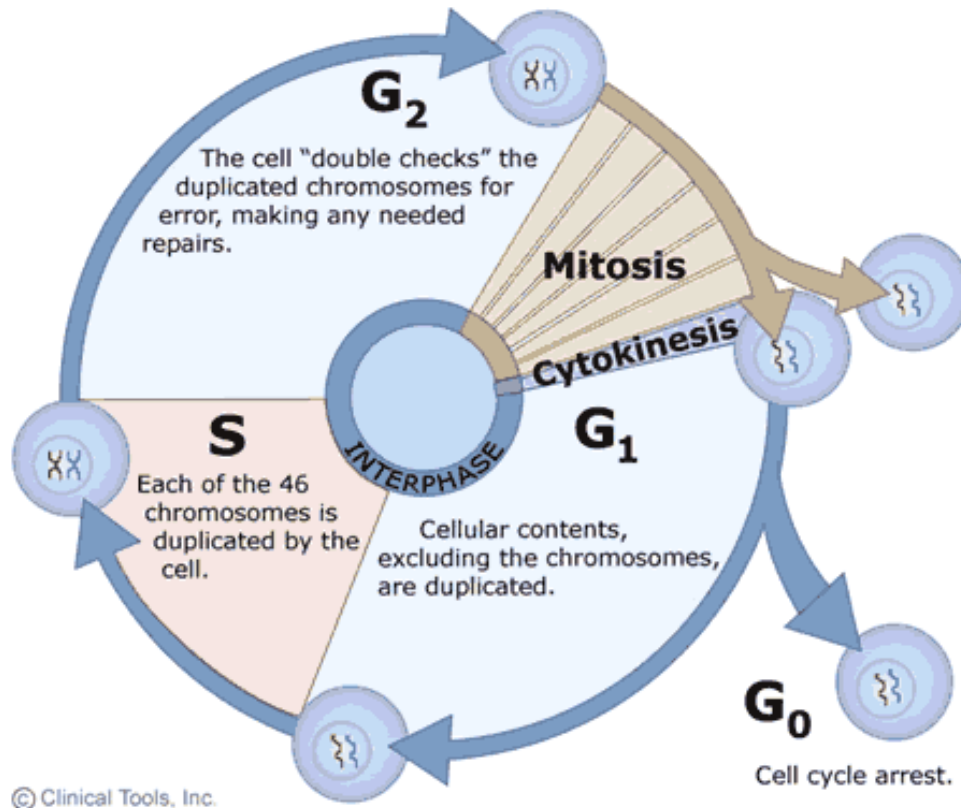


[http://en.wikipedia.org/wiki/John\\_von\\_Neumann](http://en.wikipedia.org/wiki/John_von_Neumann)

- **Idea:** Human brain → Machine to solve complex problems
- Such a machine should contain
  - self-control mechanisms
  - self-repair mechanisms
  - no difference between processors and data
- Machine capable of building itself
  - What properties does a system need to be self-replicating?
  - Logical abstraction of self-replicating mechanisms

# Self-replicating examples

## Cell division



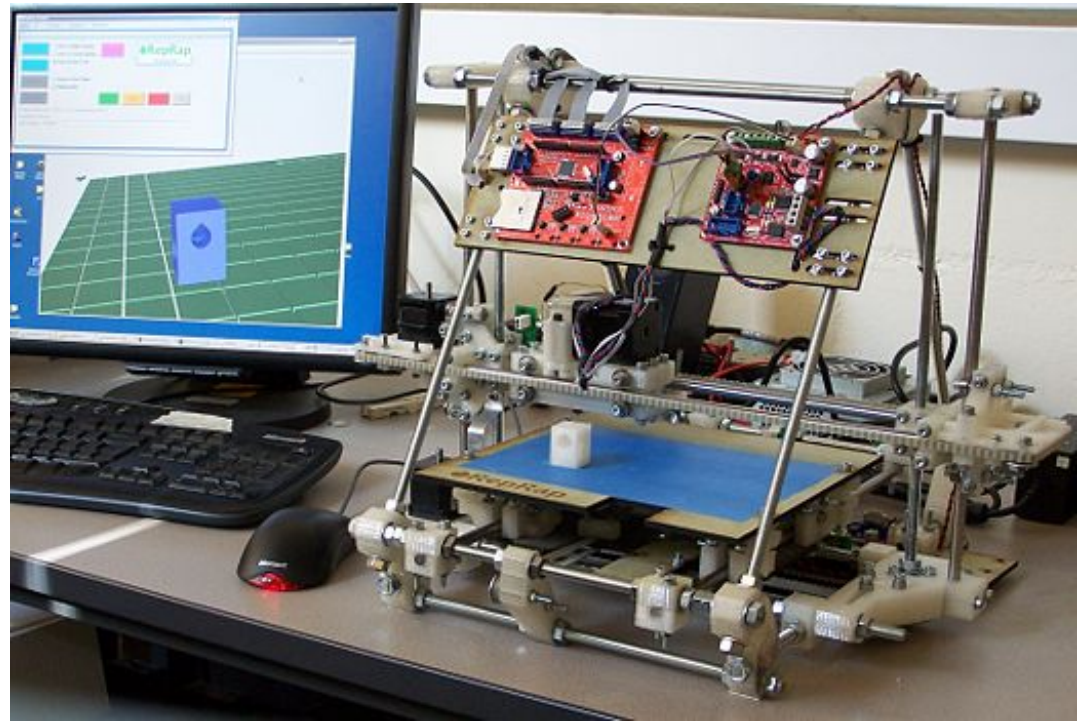
<http://bio.research.ucsc.edu/people/sullivan>

# RepRap: free desktop 3D printer

<http://RepRap.org>: 'Self-replicating' 3D printer

***RepRap is about making self-replicating machines, and making them freely available for the benefit of everyone.***

***RepRap is a [free desktop 3D printer](#) capable of printing plastic objects. Since many parts of RepRap are made from plastic and RepRap can print those parts, RepRap is a [self-replicating machine](#) - one that anyone can build given time and materials. It also means that - if you've got a RepRap - you can print lots of useful stuff, and you can [print another RepRap](#) for a [friend](#)...***



(Back to von Neumann)

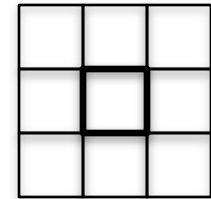
- Following suggestions of S. Ulam (1952):
  - Fully discrete universe of identical `cells`
  - Each cell has an internal `state` : e.g. finite number of bits
  - Discrete time step evolution
  - Automata, who only know a simple recipe to compute their new internal state.
  - The evolution rule is the same for all cells and a function of the states of the neighbouring cells.
- Fully discrete dynamics systems: Cellular Automata

- von Neumann's first self-replicating CA:
  - 2D square lattice
  - 29 states/cell
  - self-replicating structure = several thousands cells!
- Proof of principle
  - usually: a machine builds objects of lesser complexity than itself
  - Self-replicating CA: identical complexity and capabilities
- Property of 'Universal computation'
  - there is an initial config. of the CA which leads to the solution of any computer algorithm.



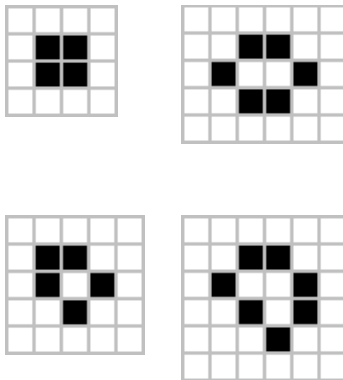
# Example: Conway's 'Game of Life'

- John Conway (1970)
- Motivation: simplify Neumann's idea
- Each cell is either alive (state 1) or dead (state 0)
- Lattice 2D, 8 nearest neighbours (Moore)
- Evolution rule (B3/S23)
  - A dead cell comes back to life if surrounded by (exactly) 3 live cells
  - A live cell dies if surrounded by less than 2 (isolation) or more than 3 (overcrowdness) live cells.

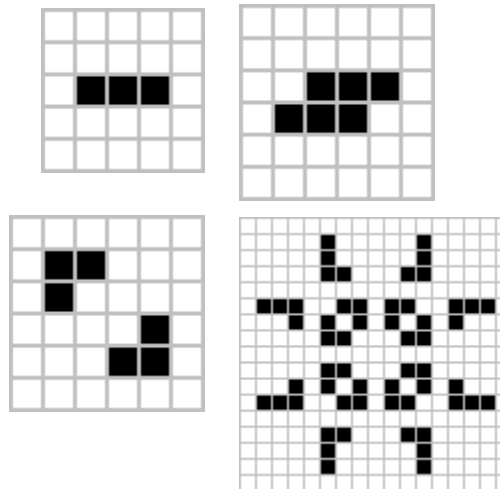


- Some Properties:
  - Capable of computational universality (Turing complete)
  - Emergence and self-organisation: complex pattern emerge from very simple (microscopic) rules
- Simulation example:
  - Java Applet: <http://www.ibiblio.org/lifepatterns/>
- Patterns:

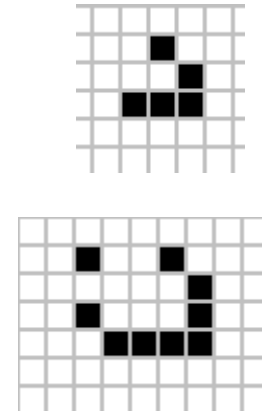
Still lives



Oscillators



'Spaceships/gliders'





Gosper's glider gun:



Breeder leaving glider  
guns in its wake:

- Philosophical implications:

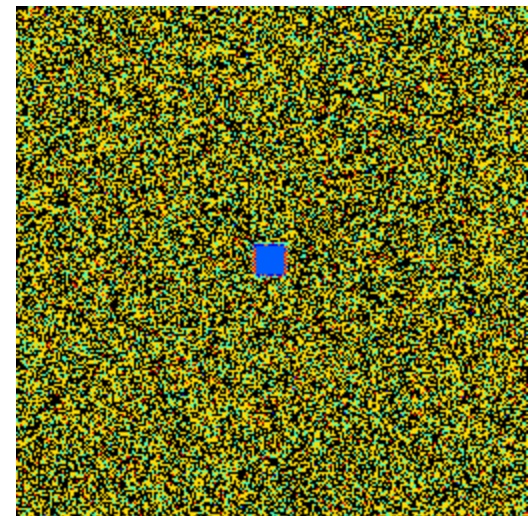
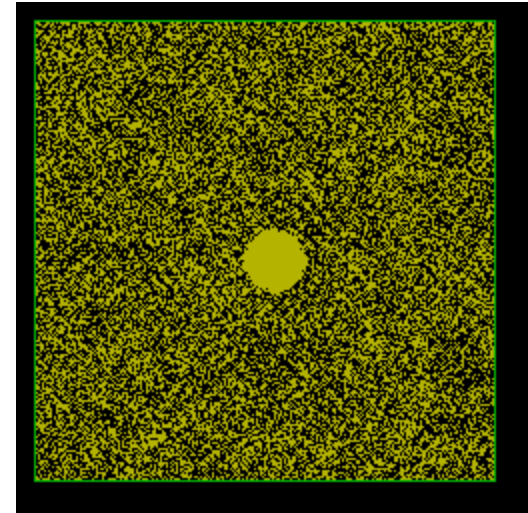
*Chaos, design and organisation can spontaneously emerge from simple deterministic physical laws*

# Modelling physical systems with CA

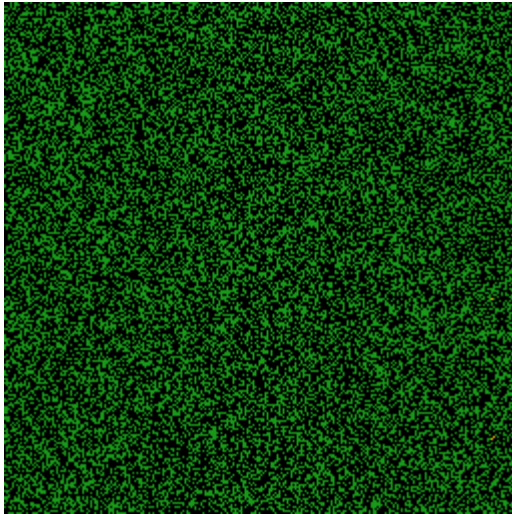
- The physical world could be a very large CA...?
- CA can provide a modeling environment for physical systems
- CA = synthetic model of a system in which physical laws (microscopic interaction) are expressed as simple local rules on a discrete space-time structure

# Some examples (overview)

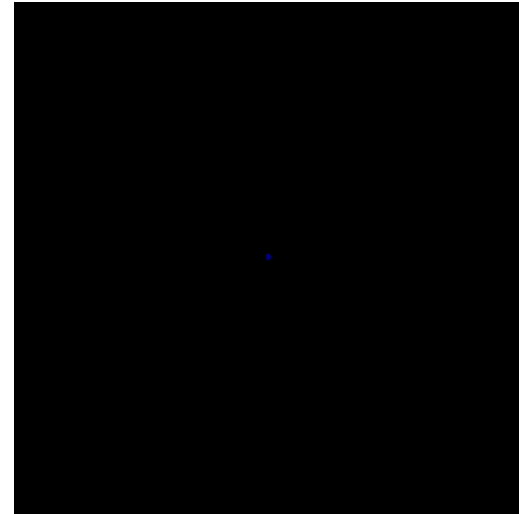
- Lattice gas (HPP, FHP):
  - Hardy, Pomeau, de Pazzis (1970)
  - Frisch, Hasslacher, Pomeau (1986)
- Discrete dynamics of particles **moving** and **colliding**
- Conservation of **momentum** and **particle numbers**
- FHP shown to be equivalent to **Navier-Stokes equation** (in some appropriate limits)



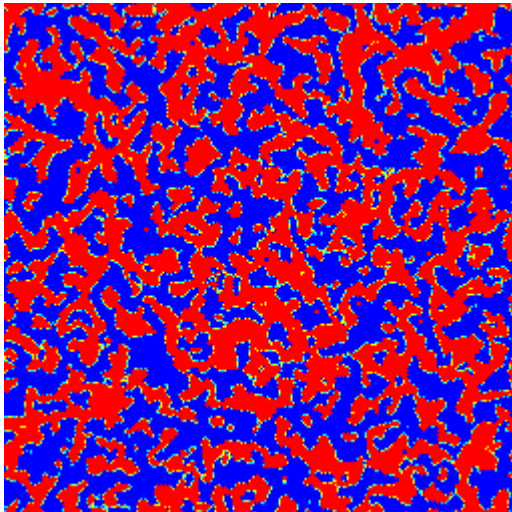
- Forest fires



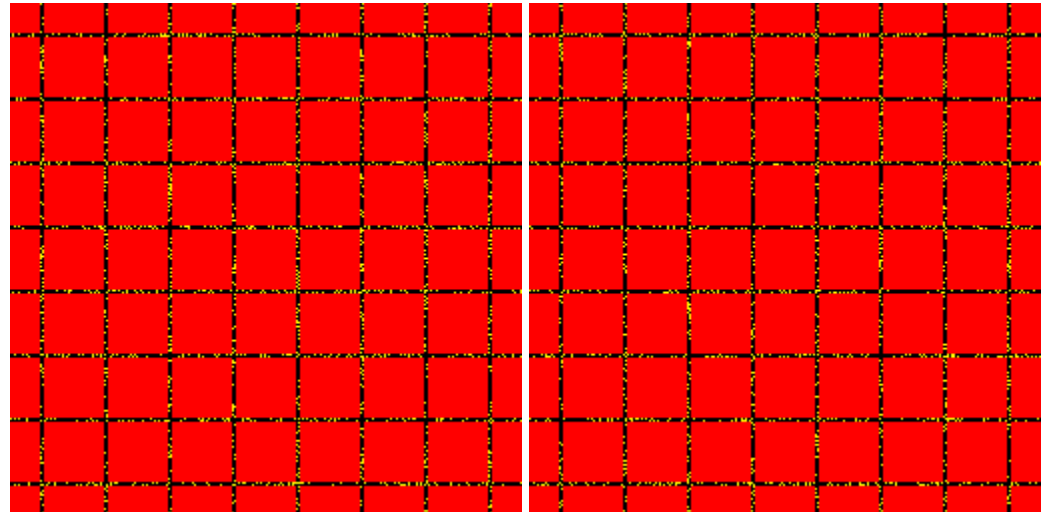
- Snow flakes



- Annealing



- Traffic flow



# CA: Formal Definition

A Cellular Automaton requires in general

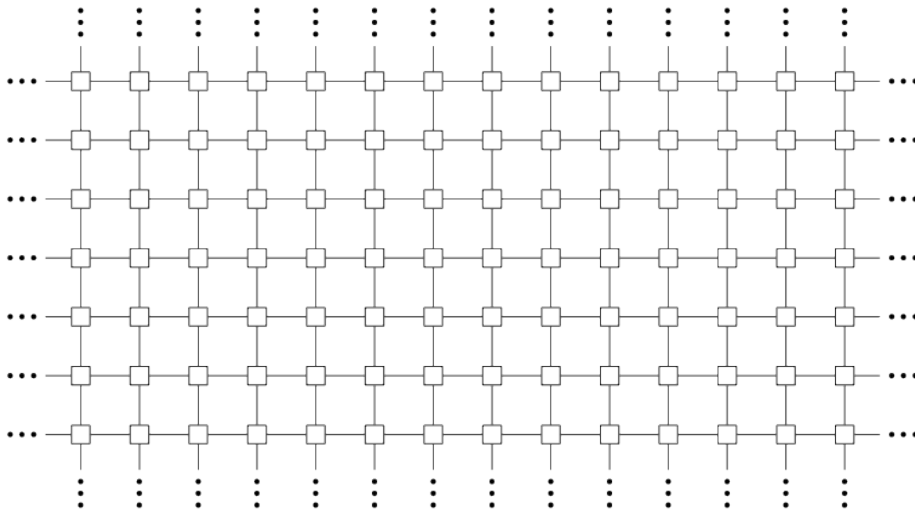
1. A regular lattice  $L$  of ordered cells
2. A finite state space  $S$  for each cell;
3. A neighbourhood  $N$  that each cell interacts with
4. An evolution rule  $R$  which specifies the time evolution of the states

# 1. A regular lattice $L$ of ordered cells

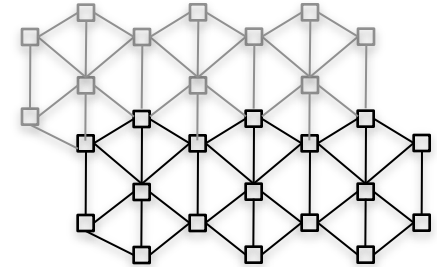
1D:  $L = \mathbb{Z}$



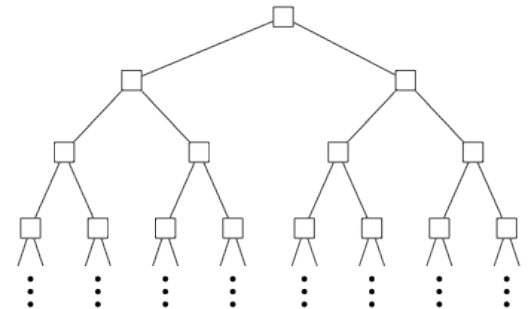
2D, 3D:  $L = \mathbb{Z}^2, \mathbb{Z}^3$



Hexagonal:  $L = H$



Other:  $L = T_2$





## 2. A finite state space $S$ for each cell

- The state space of the cells is a finite list of possible states:

$$S = \{S_1, S_2, \dots, S_m\} \quad \square \text{ in } \{ \text{0} , \text{1} , \text{2} , \text{3} \}$$

- Boolean representation of the state of a cell at position  $\mathbf{r}$  (discrete) on the lattice at time  $t = 0, 1, 2, \dots$  (discrete):

$$s(\mathbf{r}, t) = S_i = [b_1(\mathbf{r}, t), b_2(\mathbf{r}, t), \dots, b_m(\mathbf{r}, t)], \quad b_i(\mathbf{r}, t) \in \{0, 1\}$$

- Notation: often  $\mathbf{r} = (i, j)$  is used (in 2D) and the notation:

$s(\mathbf{r}, t) = s_t(\mathbf{r}) = s_t(i, j)$ ; sometimes also  $s_r(t)$ ,  $s_{i,j}(t)$  (don't be confused...!)

- A (global) configuration or microscopic state of the system is given by the set of each cell's state:

$$\{s_r\}_{r \in L}$$


### 3. A **neighbourhood** $N$ that each cell interacts with

- A cell interacts only with cells in a certain neighbourhood
- This neighbourhood is specified as a **set of relative coordinates**:

$$N = \{\mathbf{n}_1, \dots, \mathbf{n}_q\}$$

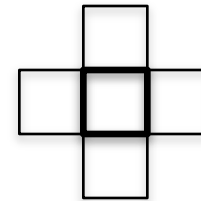
- I.e., the neighbour  $i$  of the cell at  $\mathbf{r}$  is located at  $\mathbf{r} + \mathbf{n}$
- A **local configuration at  $\mathbf{r}$**  is given by the set of each cell's state in the neighbourhood of  $\mathbf{r}$ :  $\{s_{\mathbf{r}+\mathbf{n}}\}_{\mathbf{n} \in N}$

#### Examples:

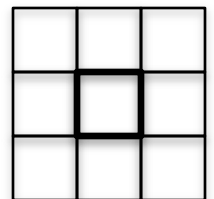
- $L = \mathbb{Z}$ ,  $N = \{-1, 0, 1\}$ : 

- $L = \mathbb{Z}$ ,  $N = \{-10, -3, 15, 32\}$

- $L = \mathbb{Z}^2$ ,  $N = \{(0,1), (-1,0), (0,0), (1,0), (0,-1)\}$  (von Neumann)



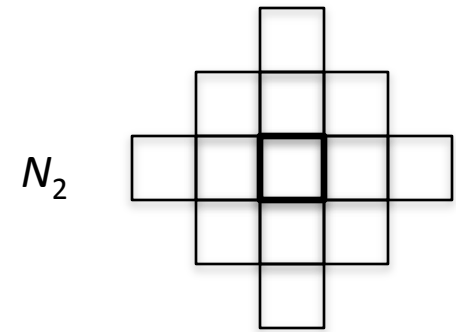
- $L = \mathbb{Z}^2$ ,  $N = \{(-1,-1), (-1,0), (-1,1), (0,-1), (0,0), \dots, (1,1)\}$  (Moore)



- von Neumann neighborhoods

- range  $R$ , in  $d$  dimensions

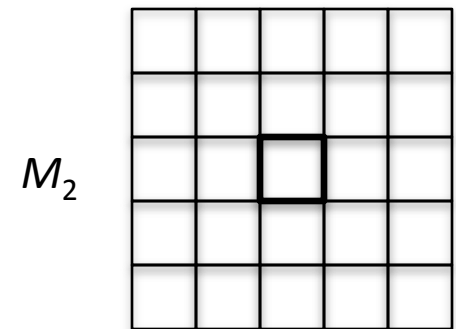
- $N_R = \{ \mathbf{r}=(i_1, \dots, i_d) : \sum_j |i_j| \leq R \}$



- Moore neighbourhoods

- range  $R$ , in  $d$  dimensions

- $M_R = \{ \mathbf{r}=(i_1, \dots, i_d) : \max_j |i_j| \leq R \}$



4. An **evolution rule**  $R$  which specifies the time evolution of the states

- The evolution rule assigns a **new state to the cell** depending on the states of its neighbouring cells:

$R$ : maps  $S^{|N|} = S \times S \times \dots \times S \longrightarrow S$  during a time step:

$$s(\mathbf{r}, t+1) = R(s(\mathbf{r}, t), s(\mathbf{r}+\mathbf{n}_1, t), s(\mathbf{r}+\mathbf{n}_2, t), \dots, s(\mathbf{r}+\mathbf{n}_q, t))$$

- The evolution rule is often given as a table;
- **The local neighbourhood determines the new state:**

N:	-1	0	1	R
	0	0	0	0
	0	0	1	1
	0	1	0	1
	0	1	1	1
	1	0	0	0
	1	0	1	1
	1	1	0	1
	1	1	1	0

Rule 110, Wolfram (1984)

- The rule is applied simultaneously for all cell: **synchronous** dynamics
- The rule is identical for all sites: it is **homogeneous** (independent of  $r$ )
- **Spatial and temporal inhomogeneities can be introduced:**
  - Define **additional bits** of the state  $s(r,t)$  set to e.g. 1 for given  $r$  and  $t$  to mark particular locations and times where different rules may apply; E.g. **Boundary cells**
- New state at  $t+1$ : only a function of previous state at  $t$ 
  - **Longer memories can be introduced:** dependence on states at  $t-1, t-2, \dots$
  - keep a copy of the previous states in the current state by **using extra bits**: E.g:  $s_{t+1} = R(s_t, s_{t-1})$ . Define  $u_t = \{s_t, s_{t-1}\}$ . Then  $u_{t+1} = R(u_t)$ .

- **Boundary conditions**

- Computer: finite lattice -> **boundaries**.
- a boundary site does not have the same neighbourhood -> different evolution rule
- Being or not at the boundary: code at the site and choose rule appropriately!
- **Another possibility**: **extend the neighbourhood for the sites at the boundary (virtual cells)**:

