

# Lectures on Cellular Automata Continued

**Modified and upgraded slides of**

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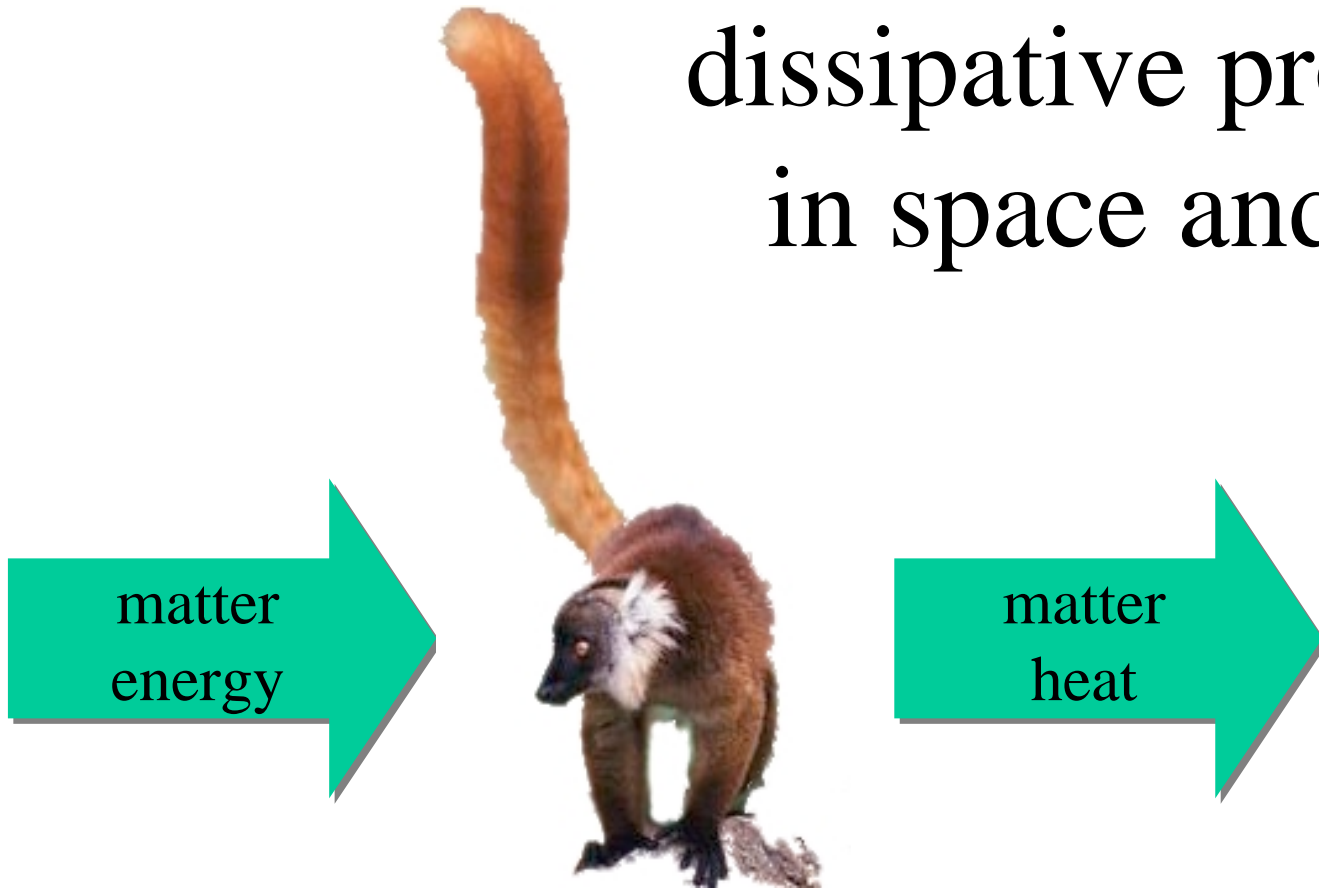
**Lubomir Ivanov**  
**Department of Computer Science**  
**Iona College**

**and anonymous from Internet**

# **Dynamical Systems and Cellular Automata**

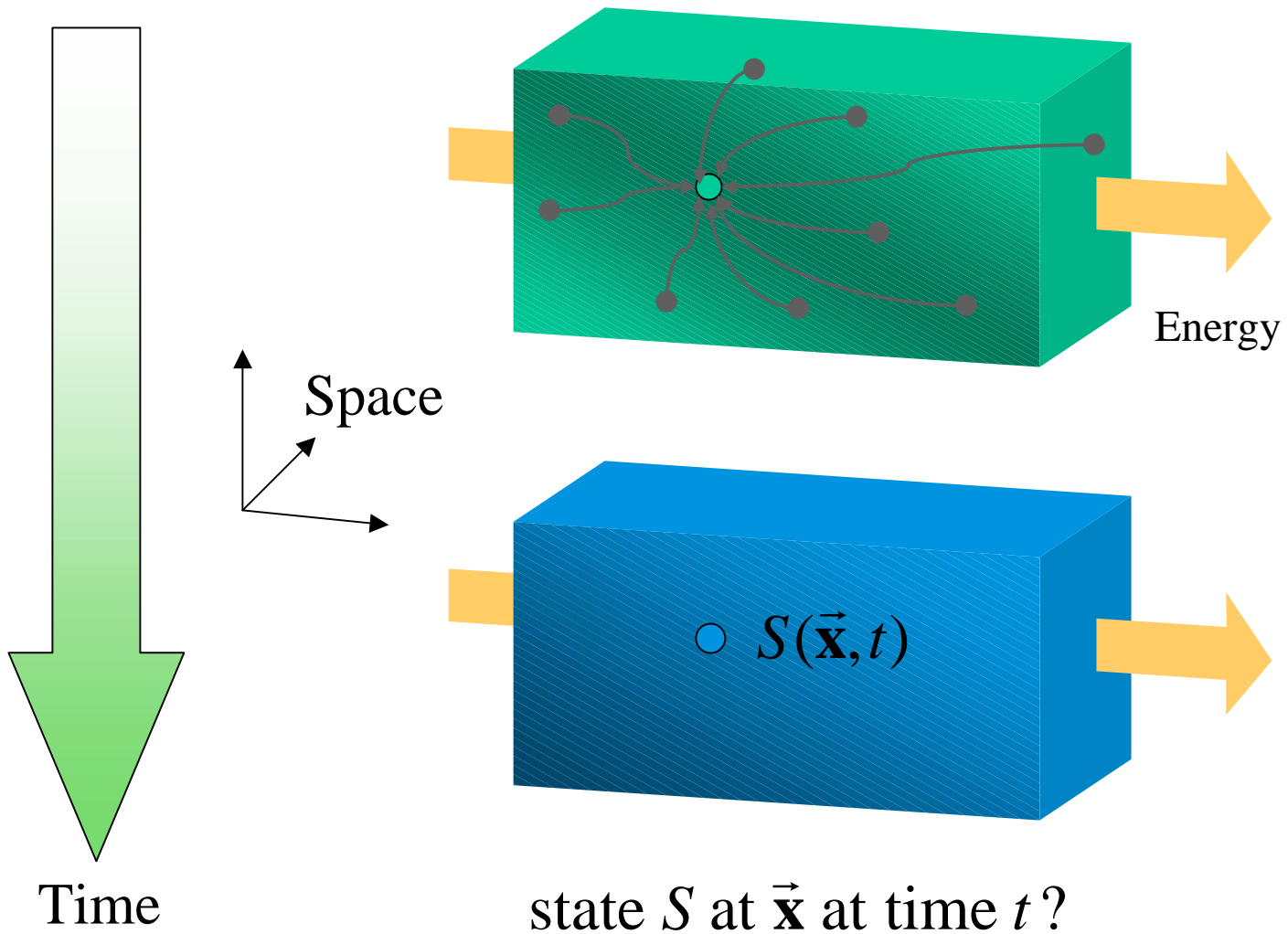
## **Morphogenetic modeling**

# Organisms are dissipative processes in space and time

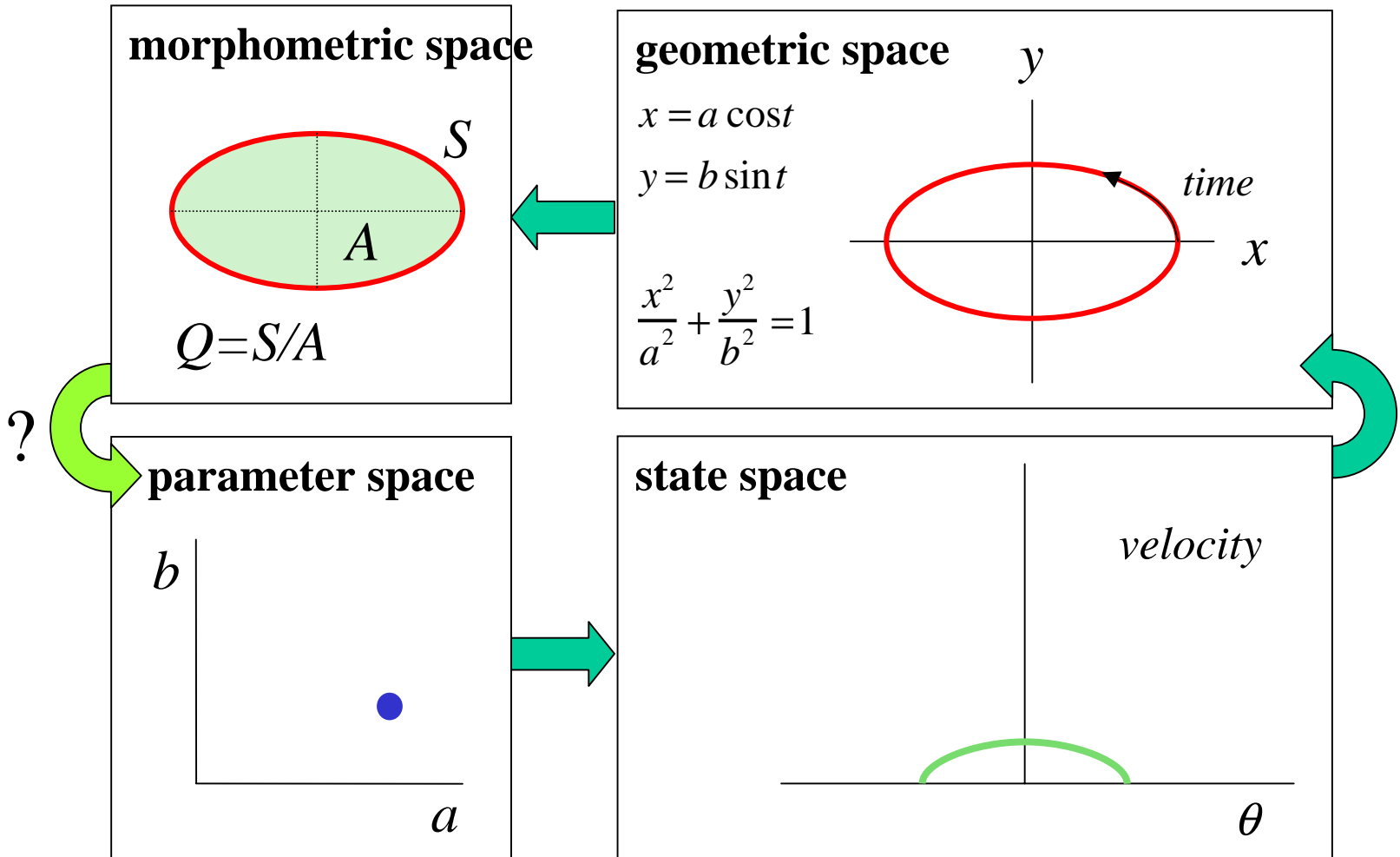


entropy dissipator

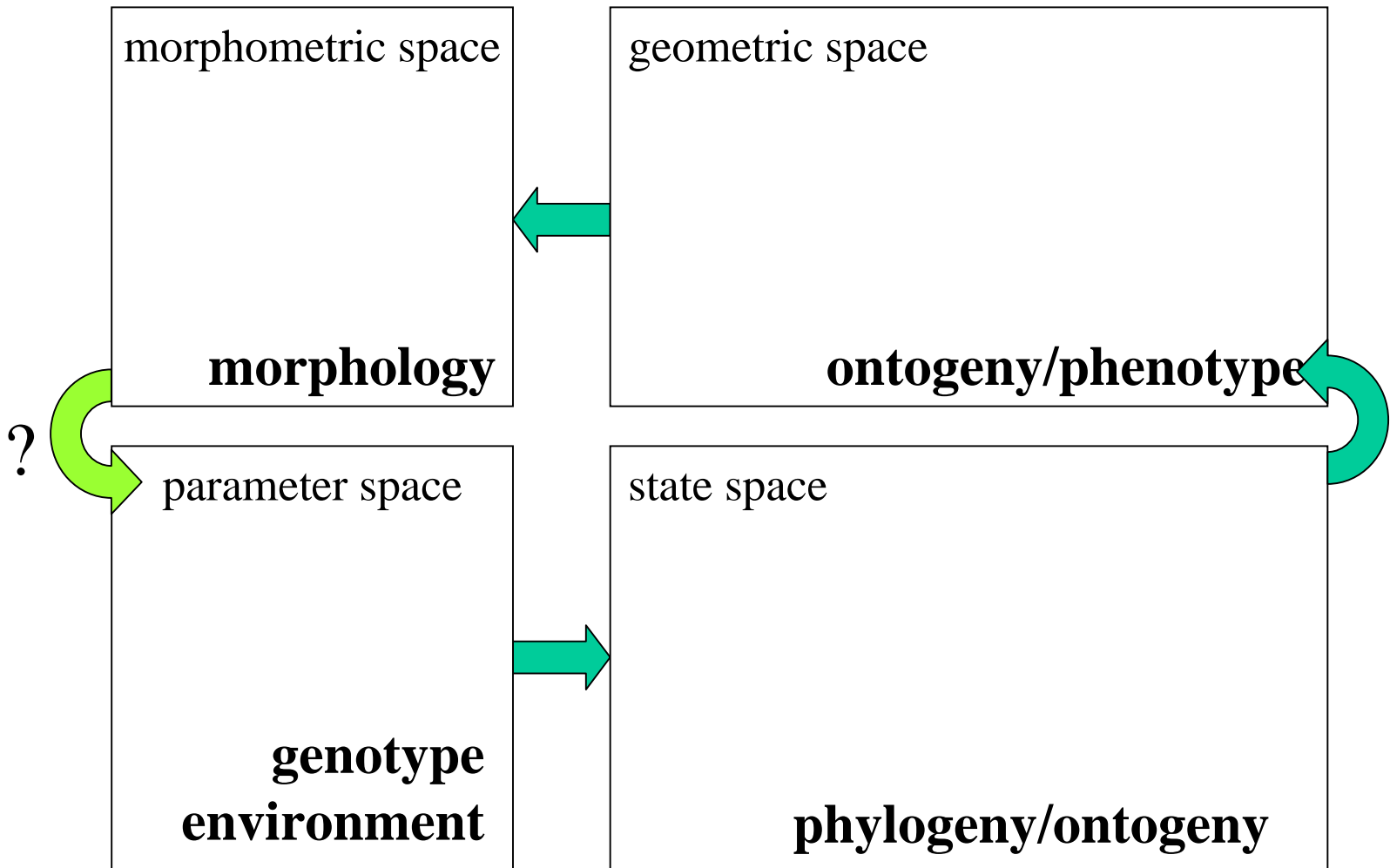
# Dynamical system



# Which space? - which geometry?



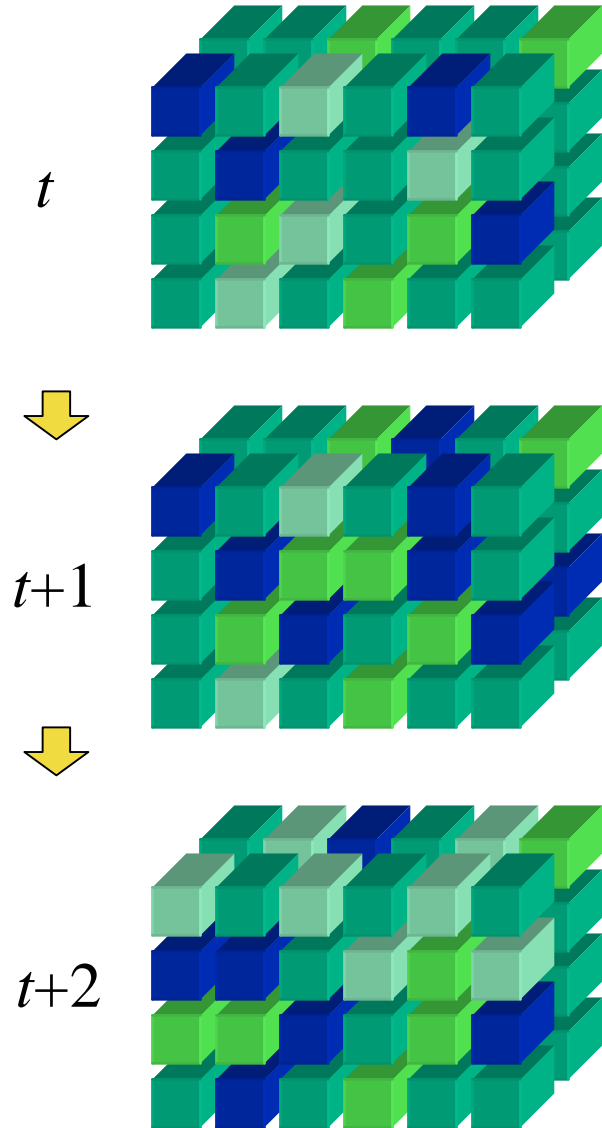
# Which space? - which geometry?



# Discretization has many aspects

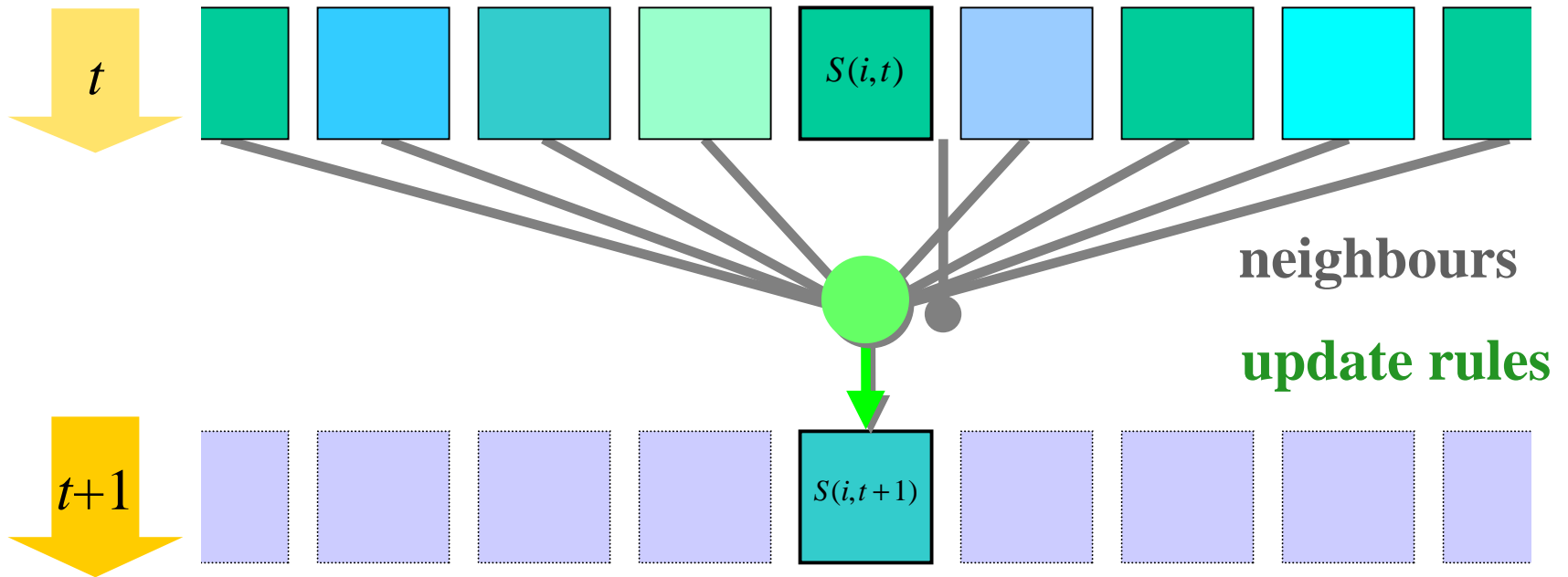
- discrete **time steps**  
 $T=0,1,2,3,\dots$
- discrete cells at  
 $X,Y,Z=0,1,2,3,\dots$
- discretize **cell states**  
 $S=0,1,2,3,\dots$

*We can mix discrete and continuous values in some models*



# Cellular Automaton

*In standard CA the values of cells are discretized*

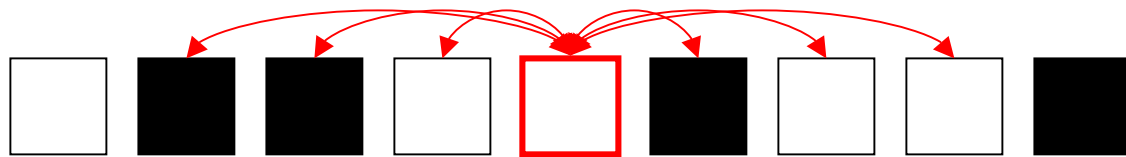


$$S(i, t + 1) = f(S(\text{neighbours}, t), \text{update rules})$$



# A simple Cellular Automaton

- **Reduce dimensions:**  $D=1$ , i.e. array of cells
- **Reduce # of cell states:** binary, i.e. 0 or 1
- **Simplify interactions:** nearest neighbours
- **Simplify update rules:** deterministic, static



# Effects of simplification

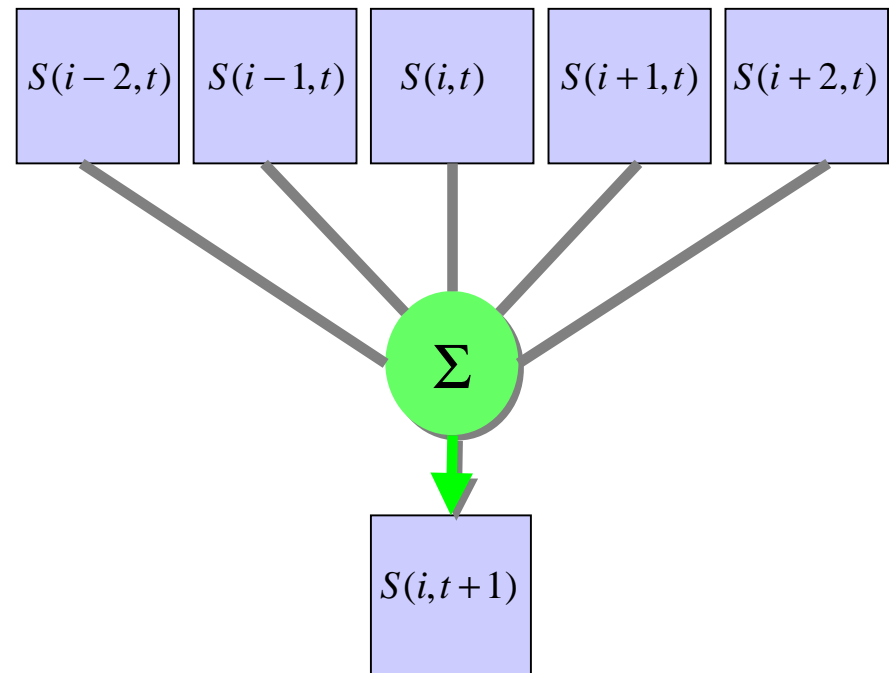
CA model	Morphogenesis
Spatial discretization	~ level of detail (organism, cell, molecule)
Temporal discretization	~ level of detail (cell cycle, reaction rate)
Reduction of dimension	→ profound effects (2D “Game of Life”)
Binarization	computational convenience (01 → A, 10 → T, 00 → G, 11 → C)
nearest-neighbour interactions	~ spatial restrictions
simple update rules; simultaneity, ubiquity	~ non-linearity → profound effects

# Wolfram's 1D binary CA

- cell array
- binary states
- 5 nearest neighbours
- „sum-of-states“ update rule:

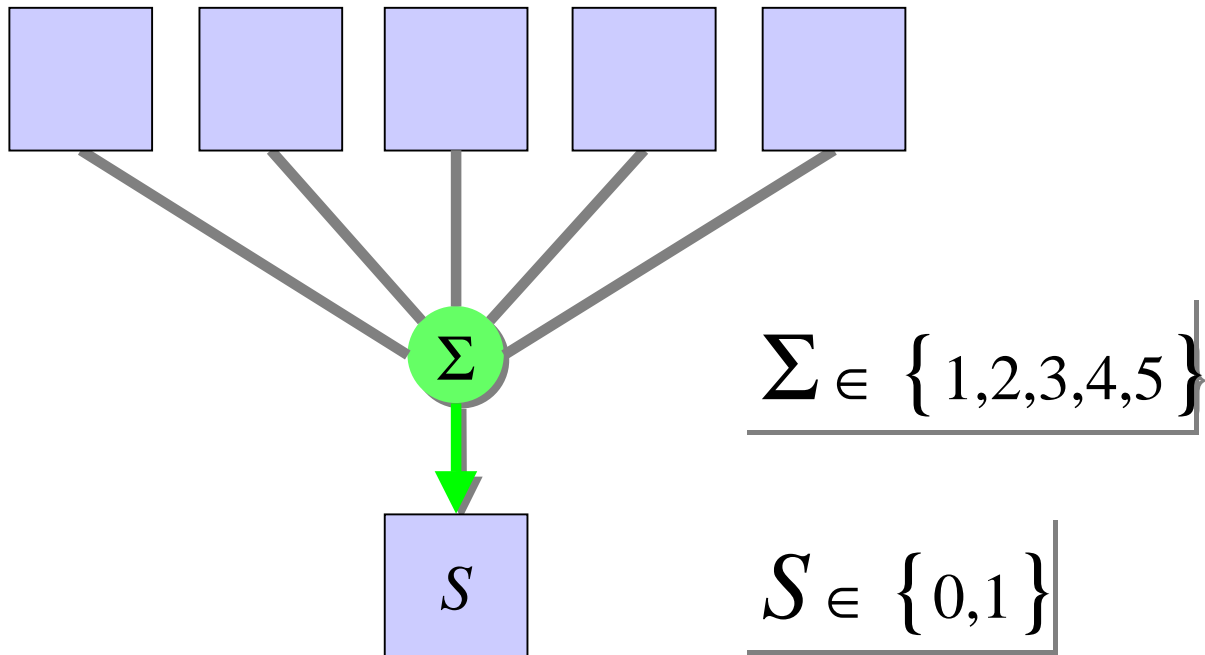
$$S(i, t + 1) = f \left( \sum_{j=-2}^{j=2} S(i + j, t) \right)$$

Wolfram, S., *Physica* **10D** (1984), 1-35



Observe importance of symmetry of logic function

# CA rules

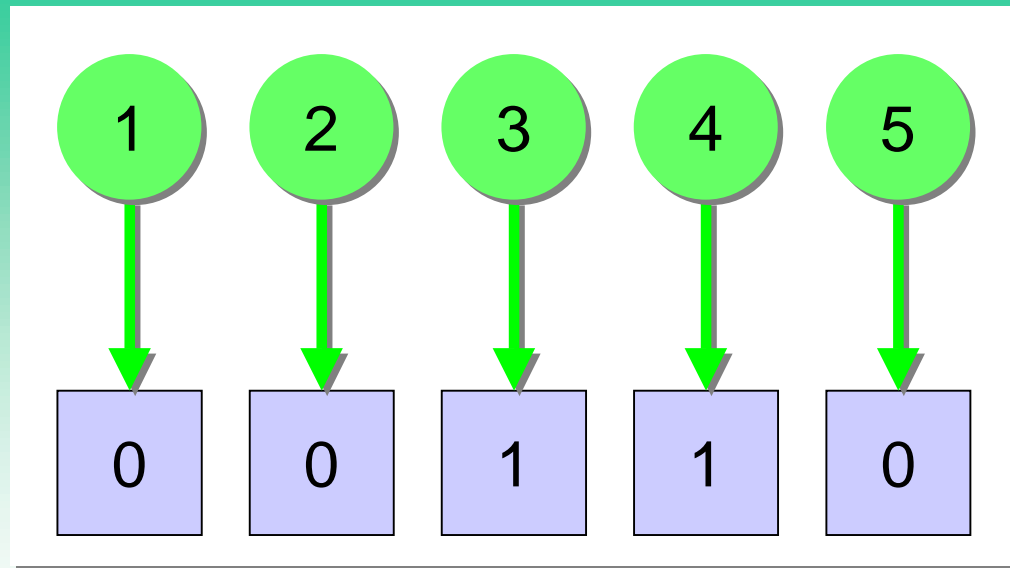


$\rightarrow 2^5 = 32$  different rules

# Code for rule 6 (00110)

$\Sigma$  neighbours

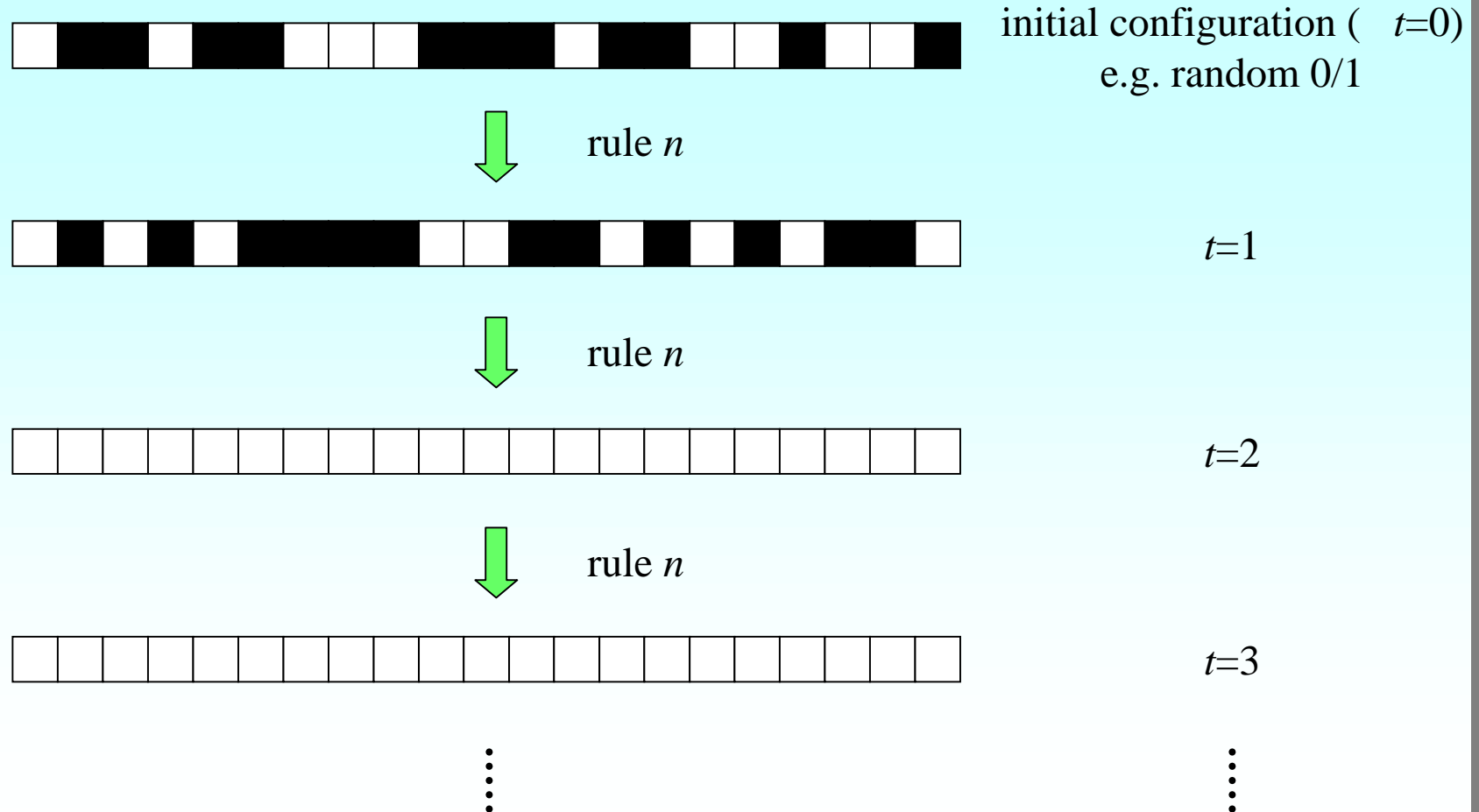
$S(i, T+1)$



# Rule codes

0	0	0	0	0	rule 0
0	0	0	0	1	rule 1
0	0	0	1	0	rule 2
0	0	0	1	1	rule 3
0	0	1	0	0	rule 4
0	0	1	0	1	rule 5
⋮					
⋮					
1	1	1	1	1	rule 32

# Temporal evolution

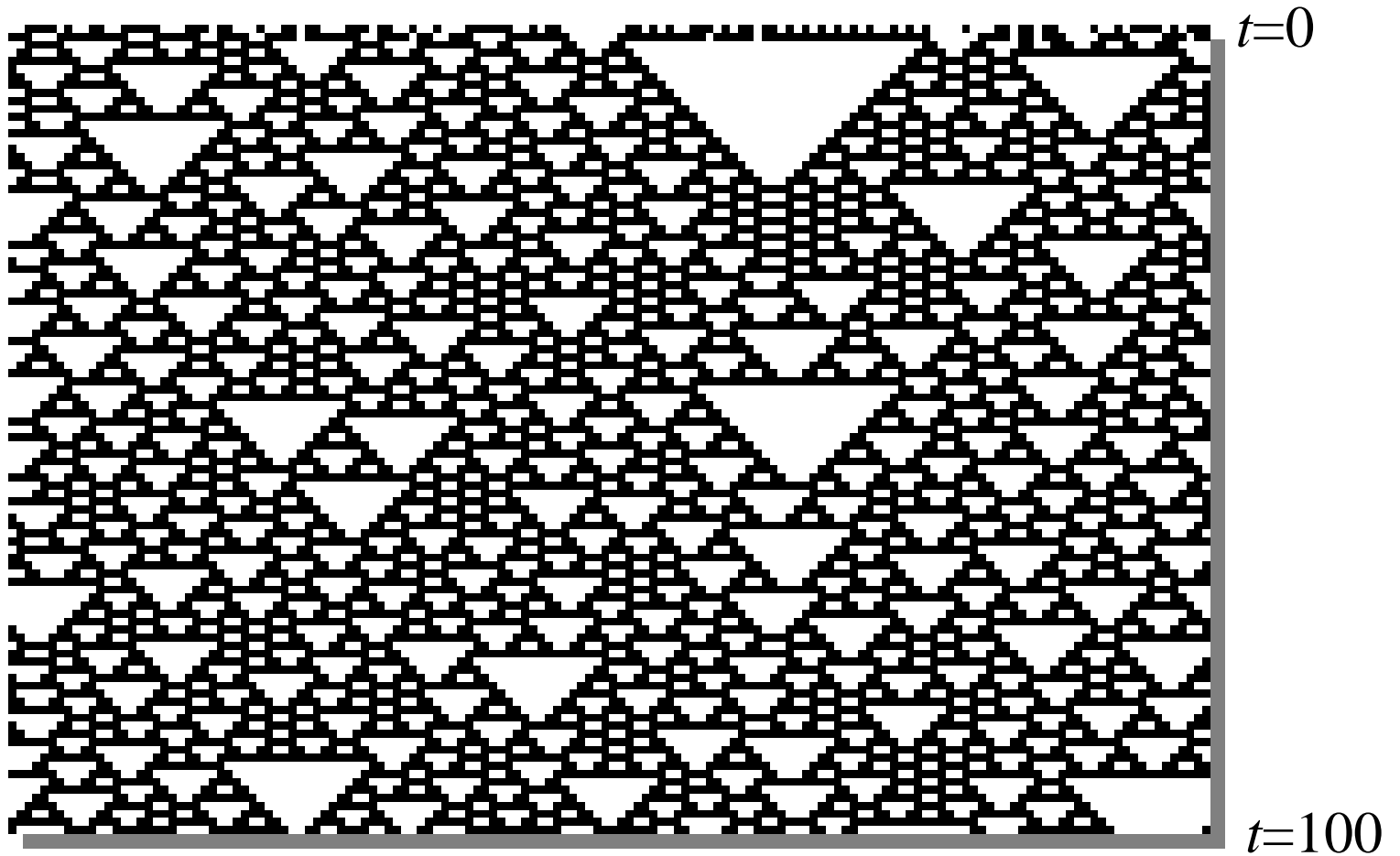


# Temporal evolution





# Rule 6: 00110

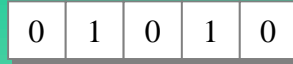


# Rule 10: 01010



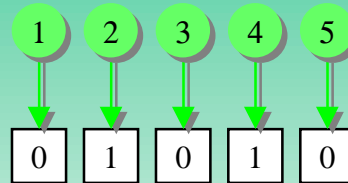
# CA: a metaphor for morphogenesis

static binary  
pattern



genotype

translated into  
state transition rule



translation,  
epigenetic rules

rule iteration in  
configuration  
space



morphogenesis  
of the phenotype

# CA: a model for morphogenesis

update rule

iterative application of the  
update rule

CA state pattern

state space

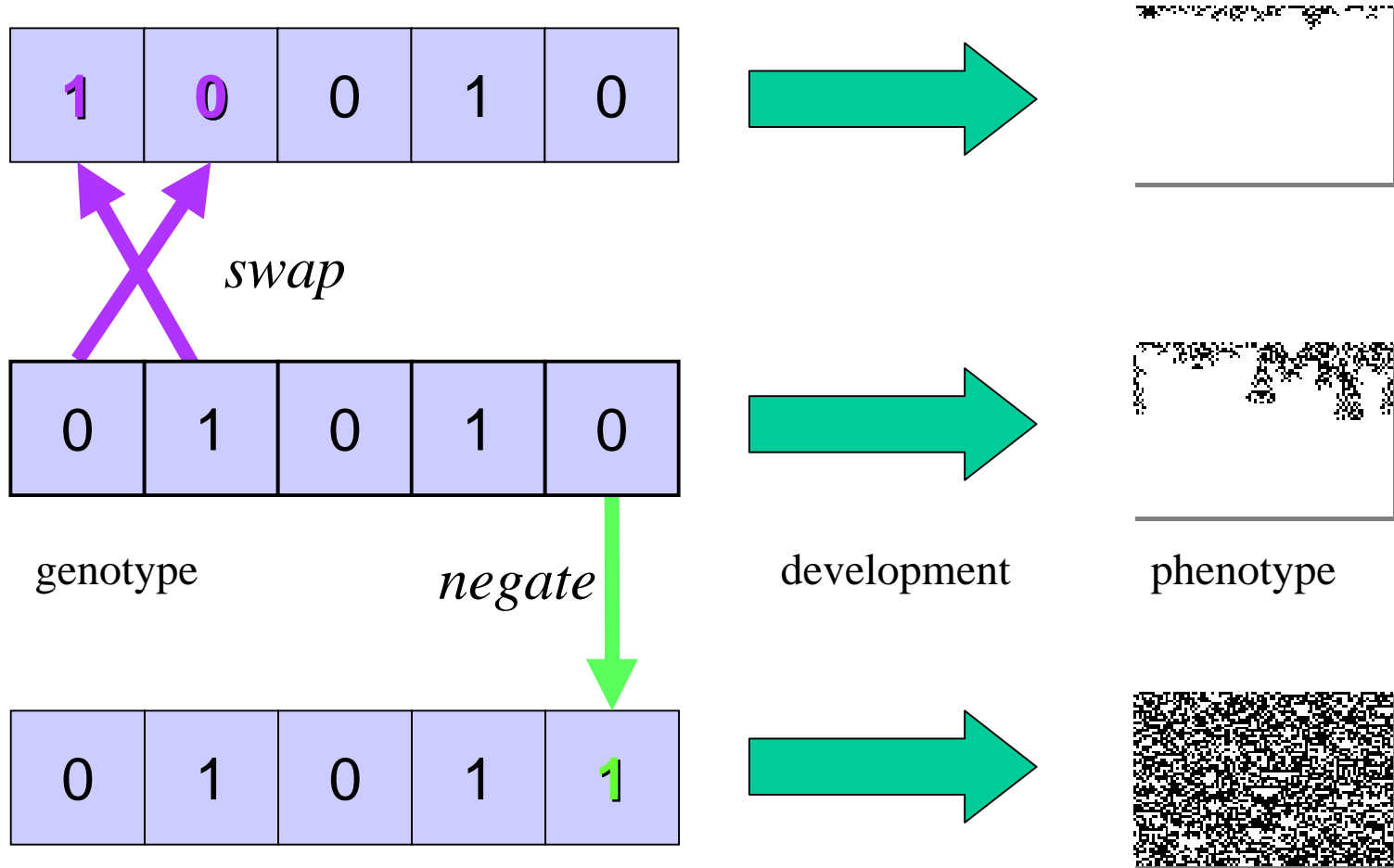
genotype

epigenetic interpretation of the  
genotype, morphogenesis

phenotype

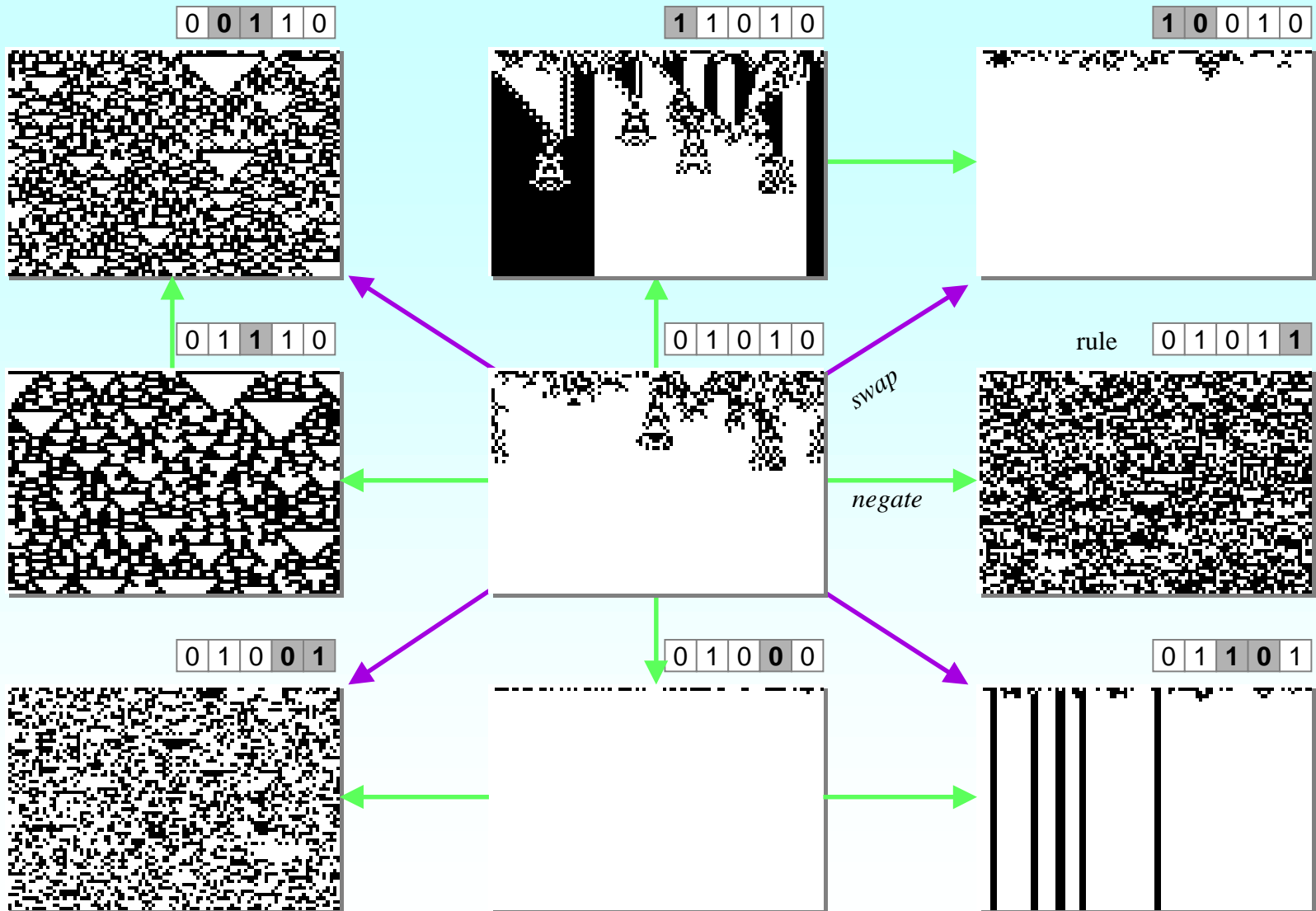
morphospace

# CA rule mutations

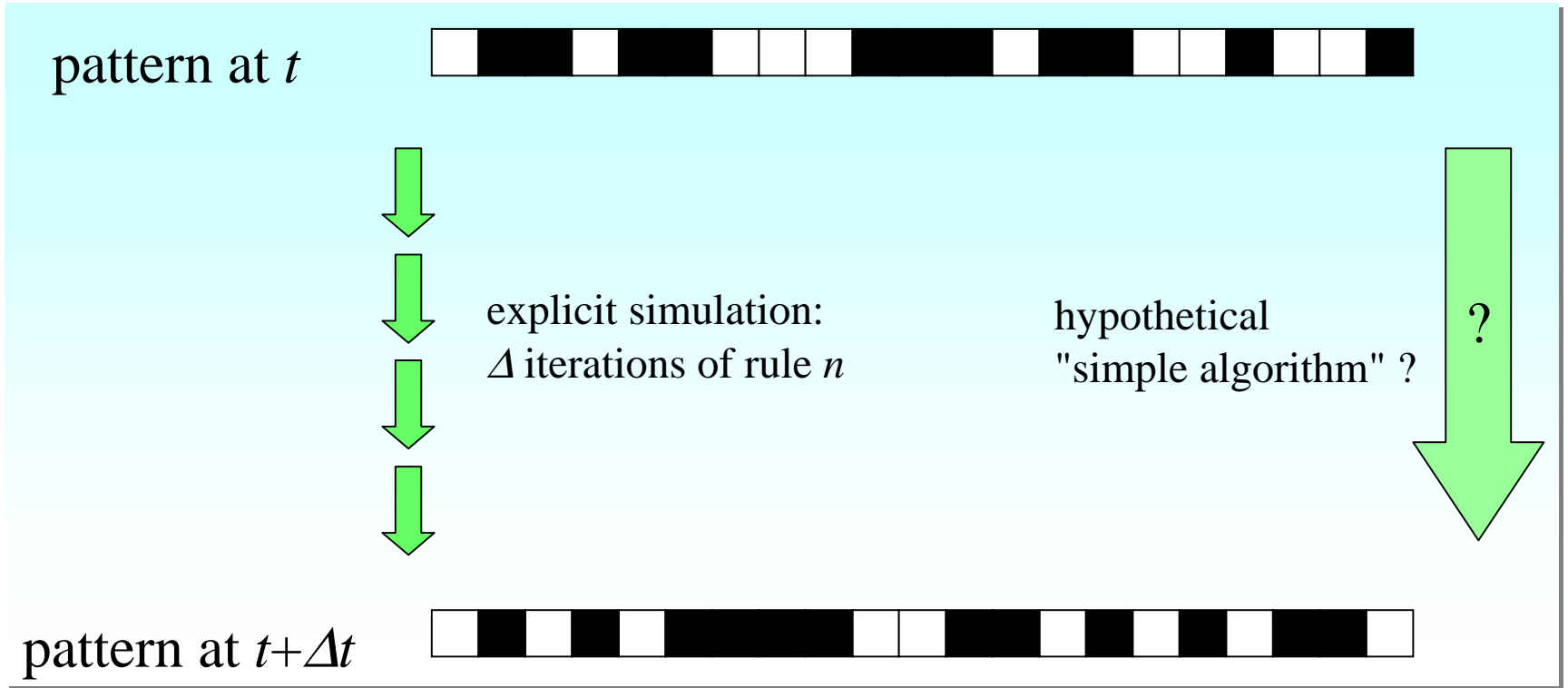


*How genotype mutations can change phenotypes?*

# CA rule mutations



# Predictability?



How to predict a next element in sequence? **Tough!**

# Predictability

**Sum of natural numbers 1...  $N$**

$$\sum_1^N n$$

algorithm 1:

$$1+2+\dots+N$$

algorithm2:

$$N(N+1)/2$$

(Gaussian formula)

easy

**$N$ th prime number**

$$p_N \in \{p_n\}$$

$$= \{p \mid p/i \notin \mathbf{N}; i \in ]1, p[ \}$$

algorithm 1:

trial and error

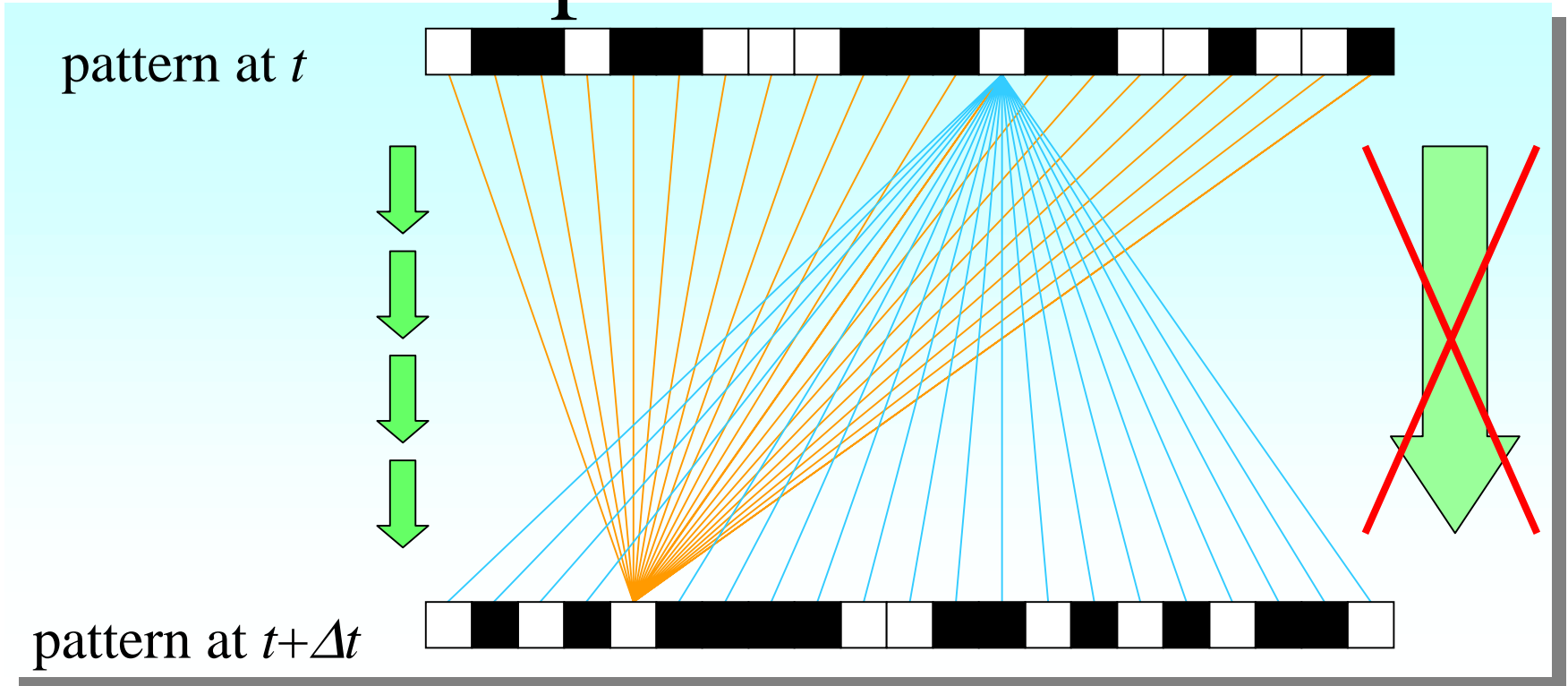
algorithm2: ?

*no general formula*

Very tough!



# CA: no effective pattern prediction



behaviour may be determined only by explicit simulation

# CA: deterministic, unpredictable, irreversible

- Simple rules generate complex spatio-temporal behavior
- For non-trivial rules, the spatio-temporal behaviour is computable **but not predictable**
- The behavior of the system is **irreversible**
- Similarity of rules **does not imply similarity of patterns**

# Aspects of CA morphogenesis

- **complex relationship** between „genotype“ and „phenotype
- effects of „genes“ are not **localizable** in specific phenes (pleiotropy)
- **phenes cannot be traced back** to specific single genes (**epistasis**)
- phenetic effects of "mutations" are **not predictable**



Meinhardt, H. (1995). *The Algorithmic Beauty of Sea Shells*. Berlin: Springer

# Patterns and morphology

- Pattern: a spatially and/or temporally ordered distribution of a physical or chemical parameter
- Pattern formation
- Form (Size and Shape)
- Morphogenesis: The spatiotemporal processes by which an organism changes its size (growth) and shape (development)

# Where is the phenome?

- Typification?
- Comparative measures?
  - length
  - density
  - fractal dimension
- Spatio-temporal development?

phenotype A



phenotype B

