

The Edge of Chaos and Undecidable Dynamics

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Review

Self-referential basis of undecidable dynamics: From the Liar paradox and the halting problem to the edge of chaos

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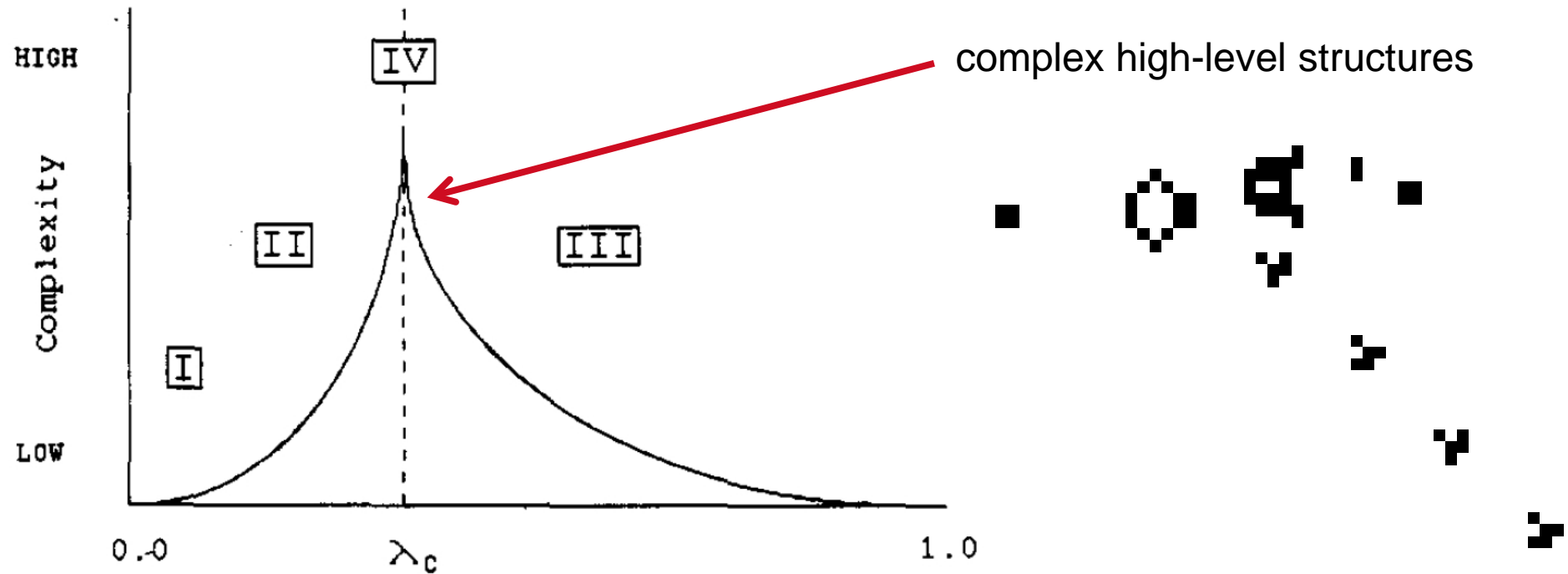
- Edge of chaos, criticality and phase transitions
 - Complex systems **are** dynamical systems with undecidable dynamics
 - The Liar paradox and the halting problem
 - Self-reference (and diagonalisation)
 - Meta-simulation and novelty generation
-



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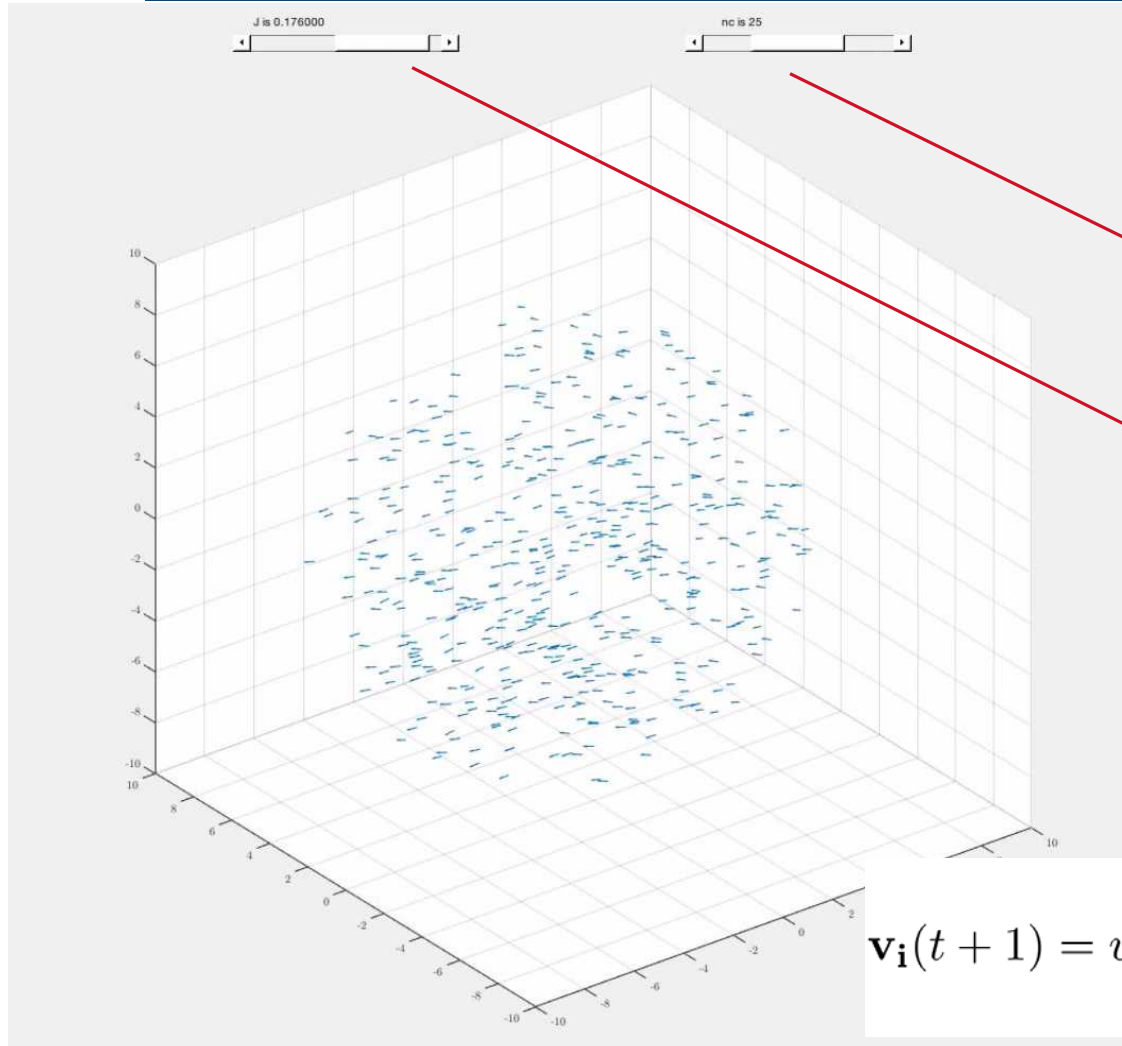
Chris Langton, “Computation at the edge of chaos: Phase transitions and emergent computation” (1991):

- how can emergence of computation be explained in a *dynamic* setting?
- how is it related to *complexity* of the system in point?





Swarming (collective) motion



a kinetic phase transition driven by

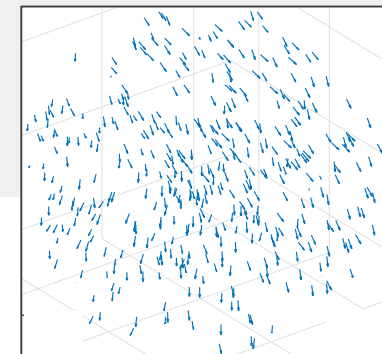
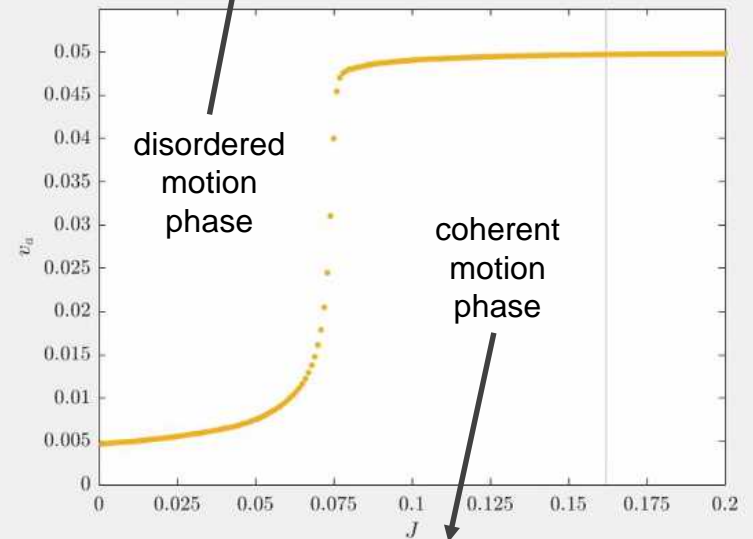
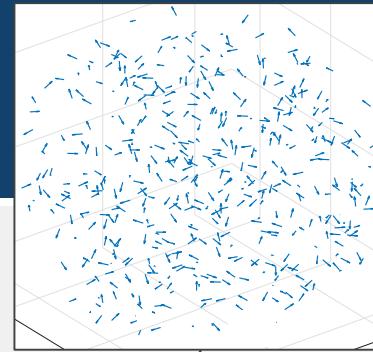
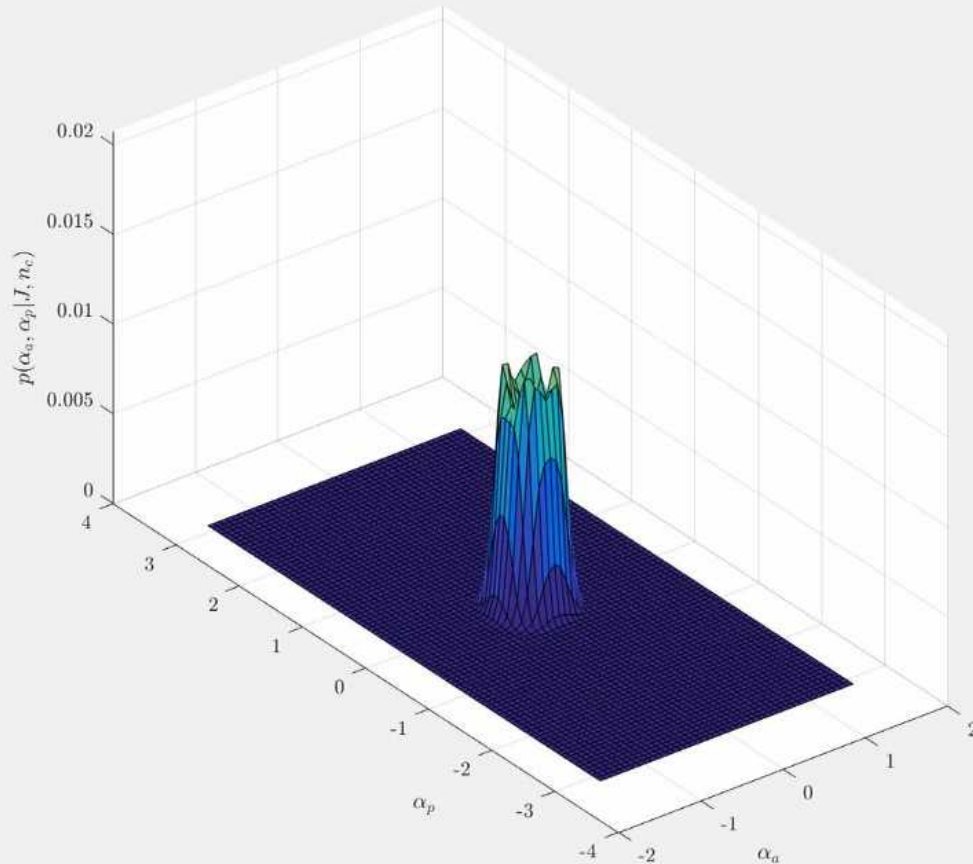
- nearest neighbours N_c

- alignment strength $J = v_0 a$

$$\mathbf{v}_i(t+1) = v_0 \Theta \left[a \sum_{j \in n_c^i} \mathbf{v}_j(t) + b \sum_{j \in n_c^i} f_{ij} + n_c \boldsymbol{\eta}_i \right]$$

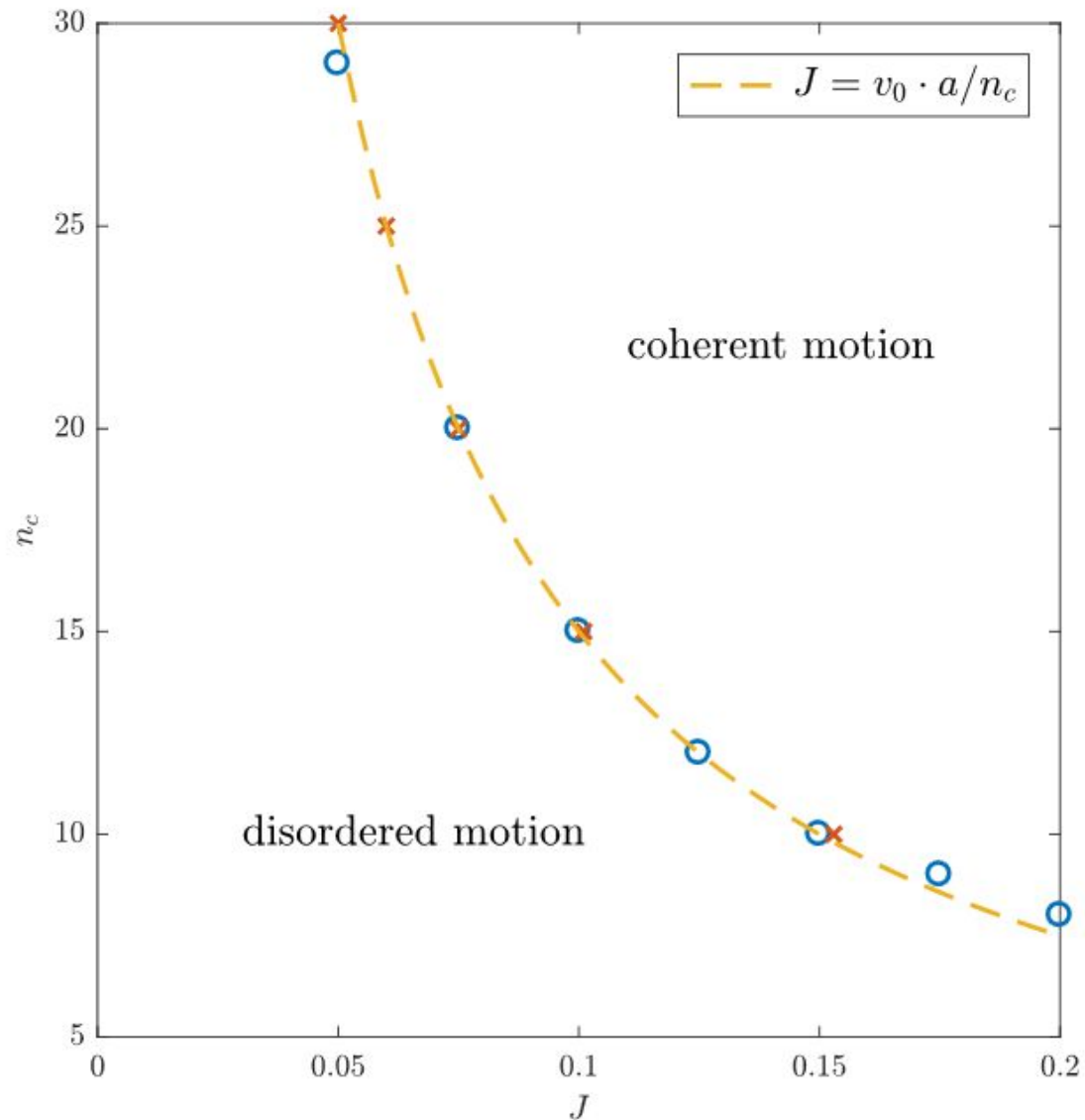


The two kinetic phases





Edge of chaos in collective motion



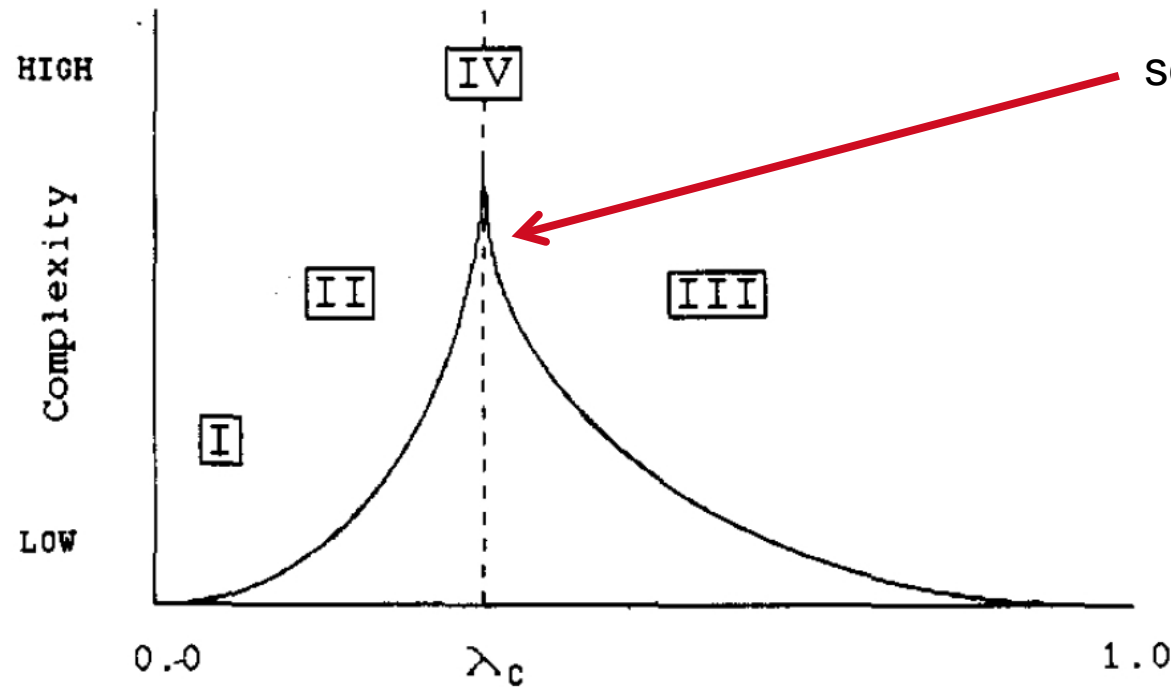


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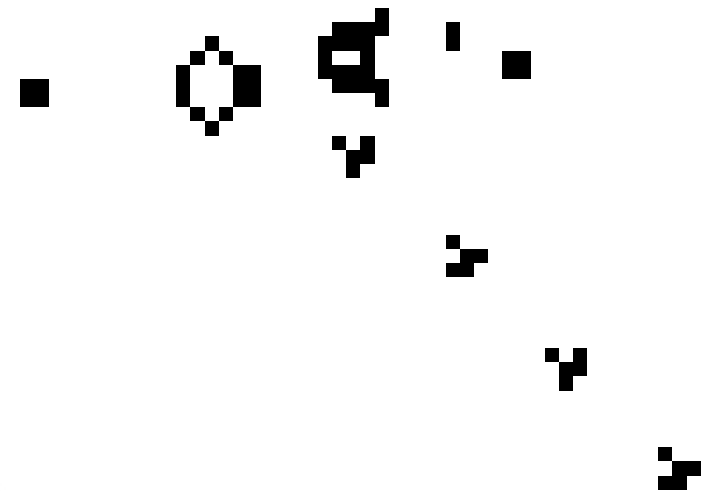


Game of Life

1. Deaths. Any live cell with fewer than two or more than three live neighbours dies.
2. Survivals. Any live cell with two or three live neighbours lives on to the next generation.
3. Births. Any dead cell with exactly three live neighbours becomes a live cell.



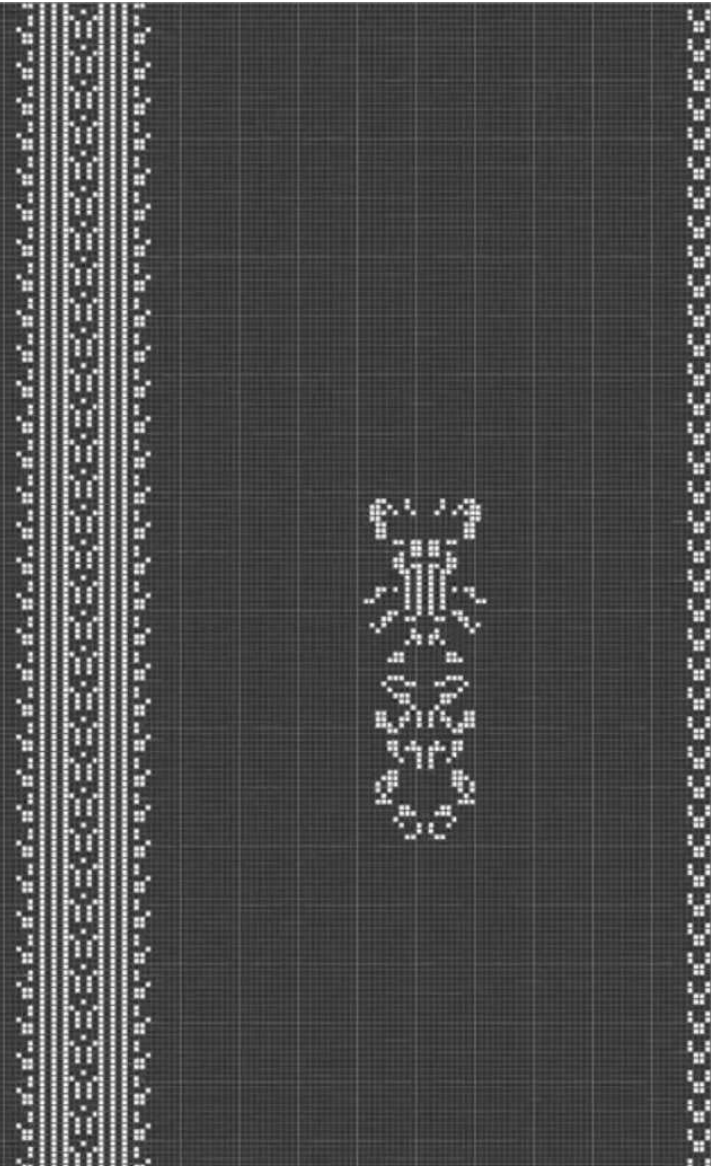
self-organising structures





Game of Life: convergence?

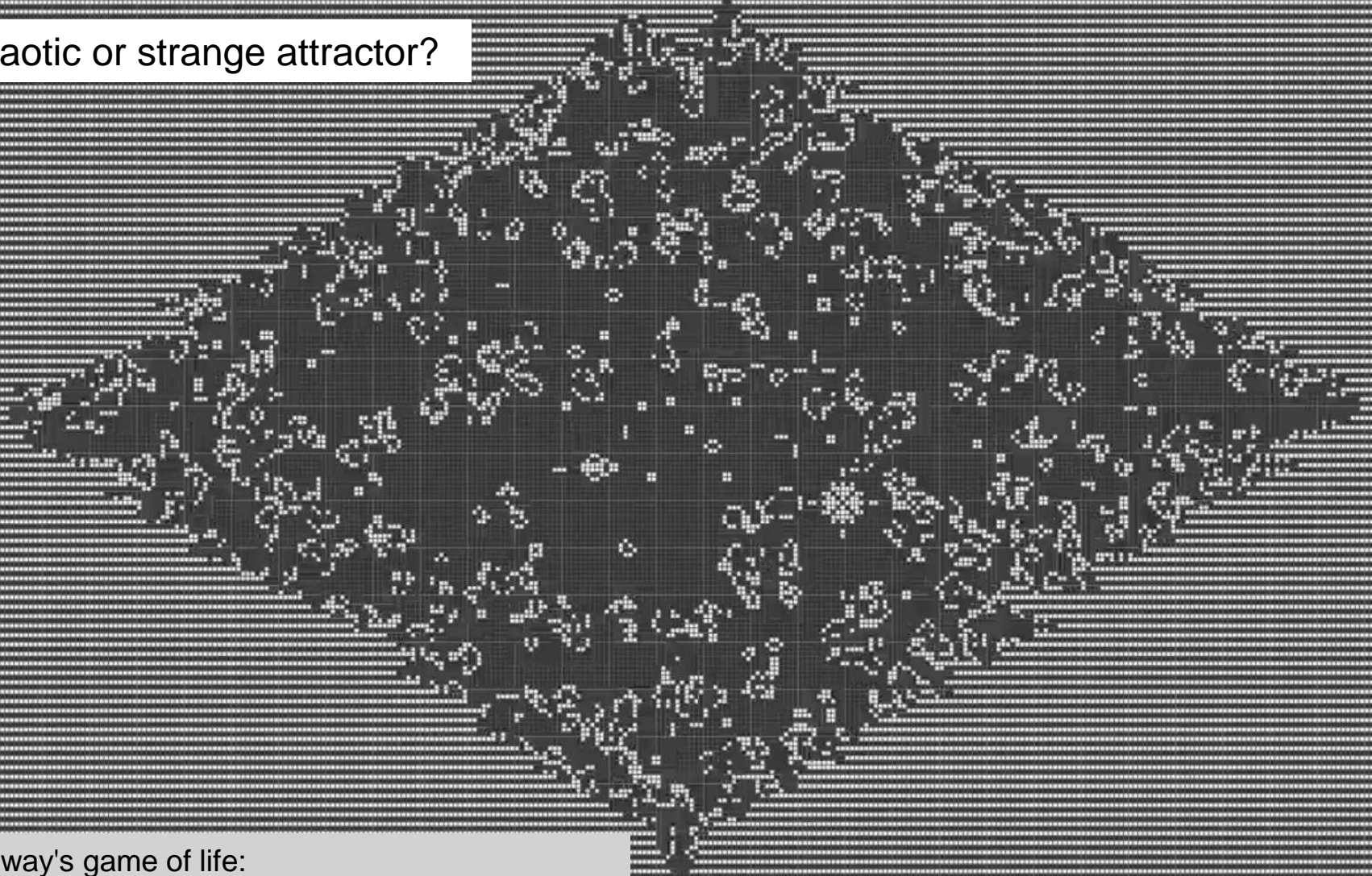
fixed point or limit cycle ?





Game of Life: convergence?

chaotic or strange attractor?



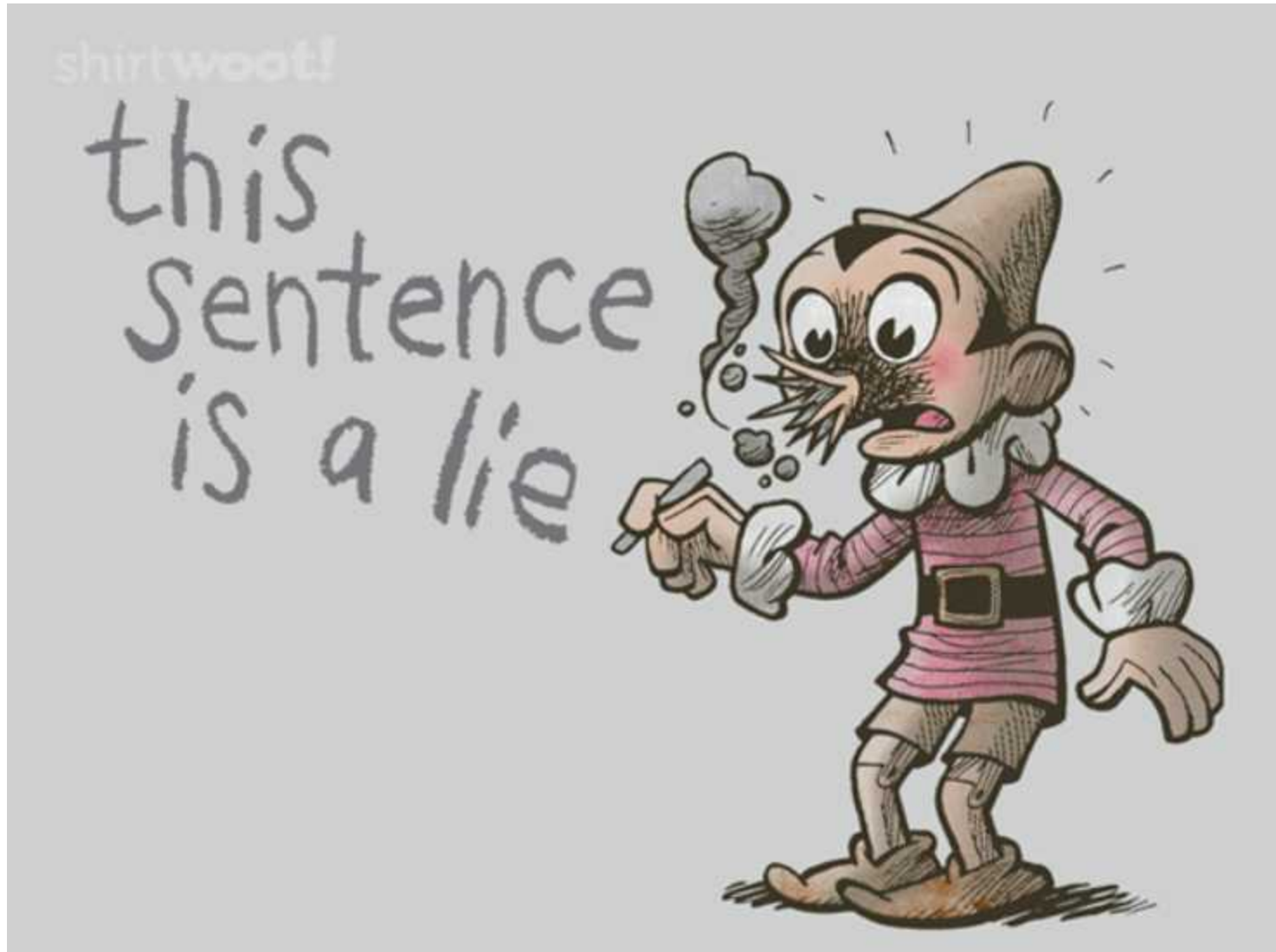
Conway's game of life:
<https://www.youtube.com/watch?v=C2vgICfQawE>



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The Liar paradox



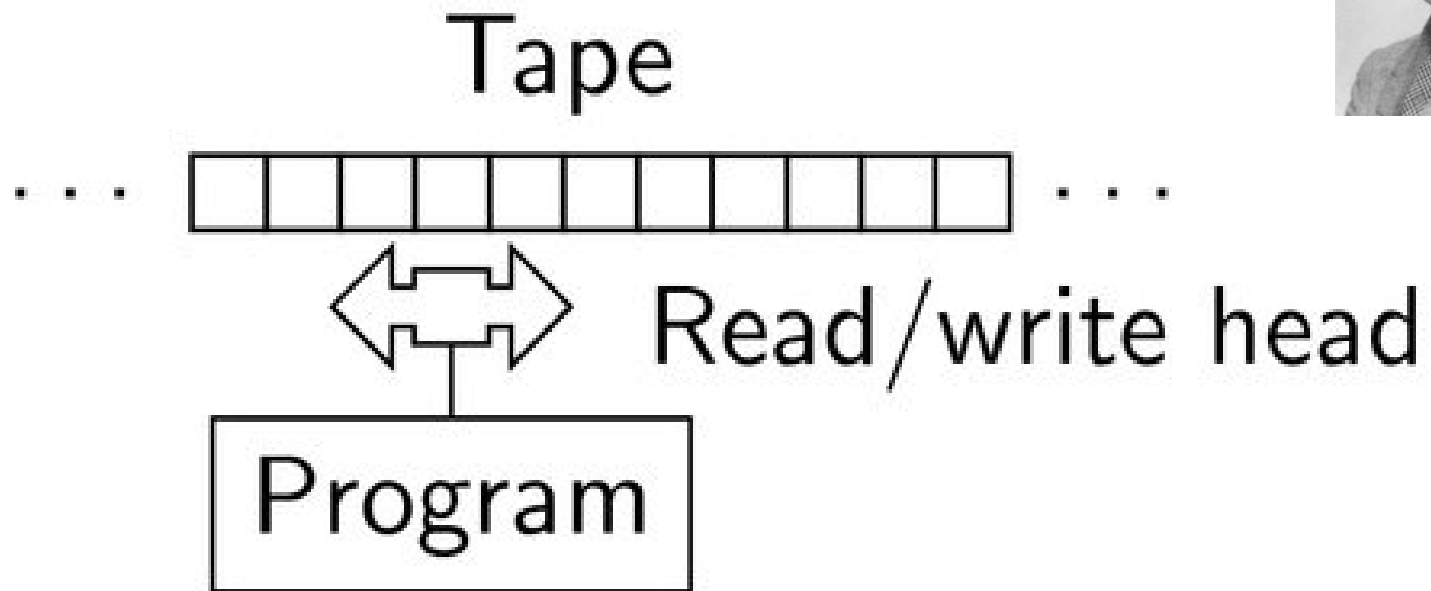


Turing Machine (...not that one)





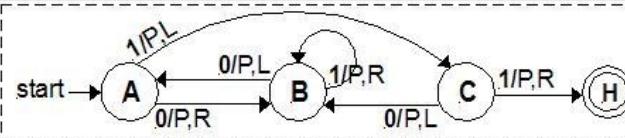
Turing Machine





Turing Machine

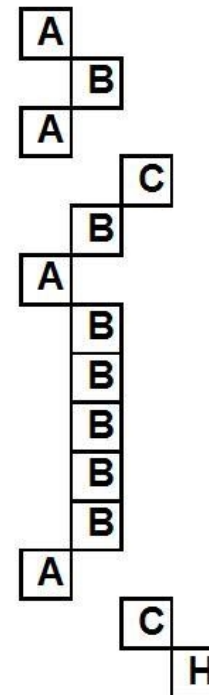
3-state busy beaver:



Total system state --
complete configuration (aka
"instantaneous description")
TAPE & TABLE & HEAD

Sequence	Instruction	Head
		0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
1	A	0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
2	B	0 0 0 0 0 0 0 0 0 1 0 0 0 0 0 0
3	A	0 0 0 0 0 0 1 1 0 0 0 0 0 0 0 0
4	C	0 0 0 0 0 1 1 0 0 0 0 0 0 0 0 0
5	B	0 0 0 0 1 1 1 0 0 0 0 0 0 0 0 0
6	A	0 0 0 1 1 1 1 0 0 0 0 0 0 0 0 0
7	B	0 0 0 0 1 1 1 1 0 0 0 0 0 0 0 0
8	B	0 0 0 0 0 1 1 1 1 0 0 0 0 0 0 0
9	B	0 0 0 0 0 0 1 1 1 1 0 0 0 0 0 0
10	B	0 0 0 0 0 0 0 1 1 1 1 1 0 0 0 0
11	B	0 0 0 0 0 0 0 0 1 1 1 1 1 0 0 0
12	A	0 0 0 0 0 0 1 1 1 1 1 1 0 0 0 0
13	C	0 0 0 0 0 1 1 1 1 1 1 0 0 0 0 0
14	H	0 0 0 0 0 0 1 1 1 1 1 1 0 0 0 0

time -->



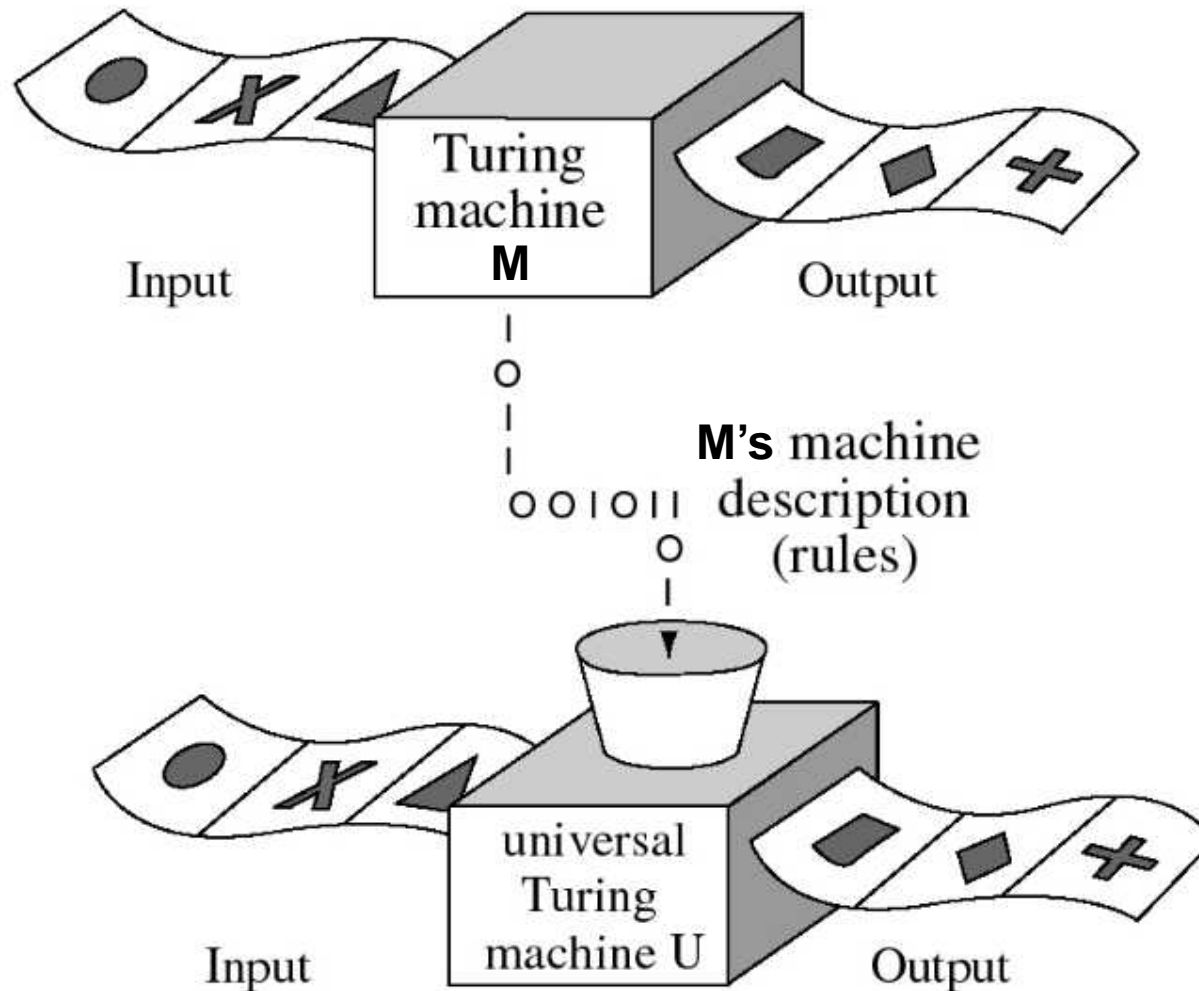
```

      A 0
      B 0 1
    1 A 1
    1 1 C 0
  1 1 1 B 0
1 1 1 1 A 0
  1 1 1 B 1 1
    1 1 B 1 1 1
      1 B 1 1 1 1
        B 1 1 1 1 1
          B 0 1 1 1 1 1
            1 A 1 1 1 1 1
              1 1 C 1 1 1 1
                1 H 1 1 1 1 1
  
```

Progress of the computation (state-trajectory) of a 3-state busy beaver



Universal Turing Machine: can simulate any other machine





Universal Decider Turing Machine: does it exist?

$$P([M, w]) = \begin{cases} \textit{accept} & \text{if } M \text{ accepts } w \\ \textit{reject} & \text{if } M \text{ does not accept } w \end{cases}$$



Universal Decider Turing Machine: does it exist?

$$P([M, w]) = \begin{cases} \textit{accept} & \text{if } M \text{ accepts } w \\ \textit{reject} & \text{if } M \text{ does not accept } w \end{cases}$$

$$V([M]) = \begin{cases} \textit{reject} & \text{if } M \text{ accepts } [M] \\ \textit{accept} & \text{if } M \text{ does not accept } [M] \end{cases}$$

Universal Decider Turing Machine: does not exist!

$$P([M, w]) = \begin{cases} \text{accept} & \text{if } M \text{ accepts } w \\ \text{reject} & \text{if } M \text{ does not accept } w \end{cases}$$

$$V([M]) = \begin{cases} \text{reject} & \text{if } M \text{ accepts } [M] \\ \text{accept} & \text{if } M \text{ does not accept } [M] \end{cases}$$

$$V([V]) = \begin{cases} \text{reject} & \text{if } V \text{ accepts } [V] \\ \text{accept} & \text{if } V \text{ does not accept } [V] \end{cases}$$



The Liar paradox

shirtwoot!

this
sentence
is a lie



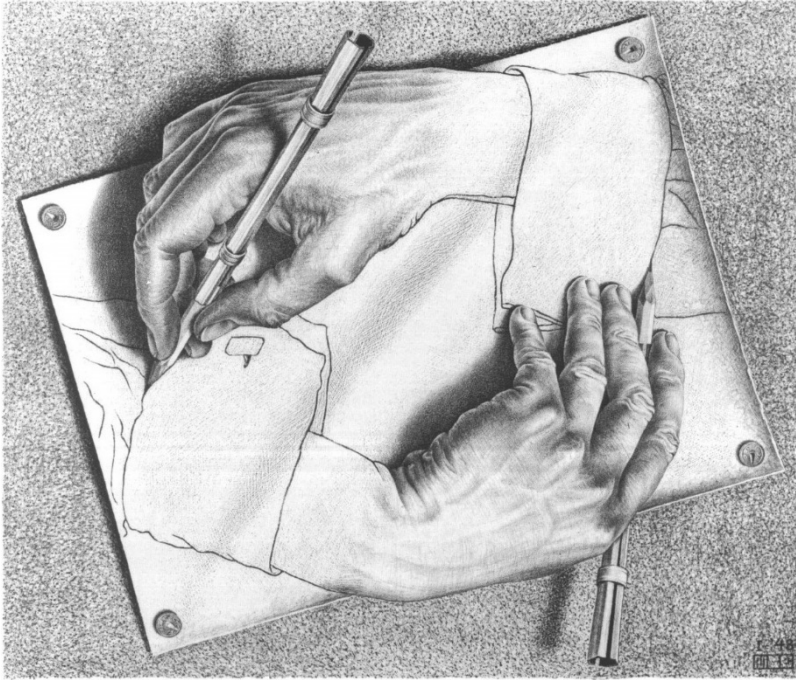
$$\mathcal{F} \vdash \gamma \leftrightarrow \neg \text{Provable}_{\mathcal{F}}(\ulcorner \gamma \urcorner)$$



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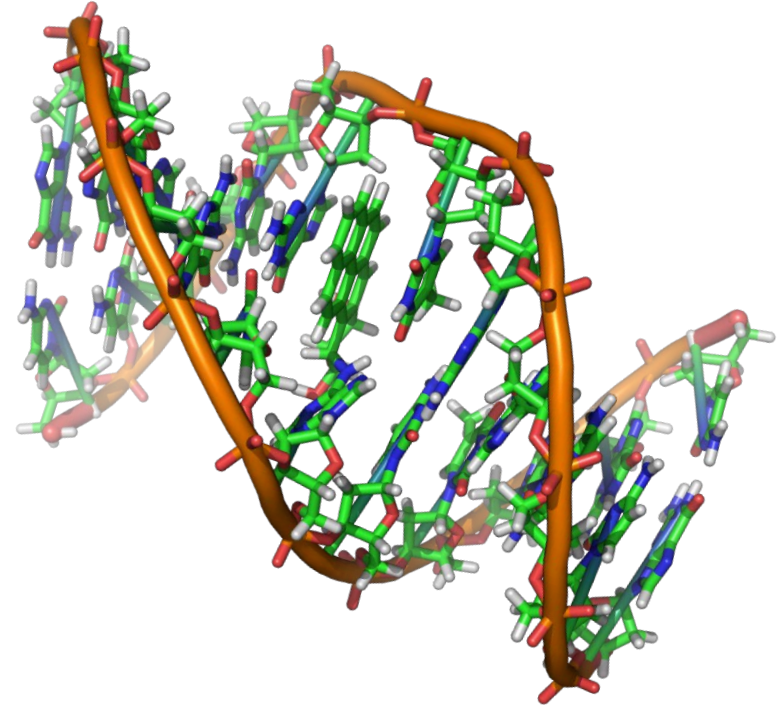


Self-reference



Drawing Hands:

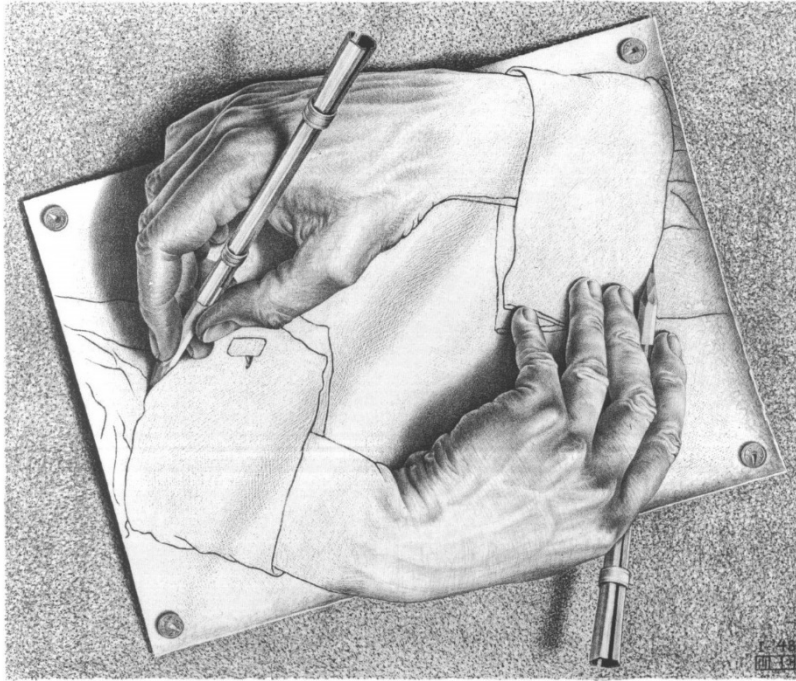
the product, the hands, are undertaking the operation – the drawing of the hands



DNA: genetic instructions (*sequence*) used in development and functioning of a living organism (*structure*) – a set of “blueprints” needed to construct other components of cells, and copy itself



Self-reference



Drawing Hands:

the product, the hands, are undertaking the operation – the drawing of the hands



El Farol Bar Problem:

if less than 60% of the population go to the bar, then 😊😊😊😊

if more than 60% of the population go to the bar, then 😞😞😞😞😞😞😞😞

Self-reference and diagonalisation

Table 3

The cell i, j is 'accept' if M_i accepts $[M_j]$

	$[M_1]$	$[M_2]$	$[M_3]$...
M_1	accept		accept	
M_2	accept	accept	accept	...
M_3		accept		
\vdots		\vdots		\ddots



Self-reference and diagonalisation

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The cell i, j is 'accept' if M_i accepts $[M_j]$

	$[M_1]$	$[M_2]$	$[M_3]$...
M_1	accept		accept	
M_2	accept	accept	accept	...
M_3		accept		
\vdots		\vdots		\ddots

Table 4

The cell i, j is the outcome of running P on $[M_i[M_j]]$

	$[M_1]$	$[M_2]$	$[M_3]$...
M_1	accept	reject	accept	
M_2	accept	accept	accept	...
M_3	reject	accept	reject	
\vdots		\vdots		\ddots

universal decider



Self-reference and diagonalisation

inverter of universal decider

Table 5

The cell (k, j) is the outcome of running $V = M_k$ (the inverter of P) on $[M_k[M_j]]$

	$[M_1]$	$[M_2]$	$[M_3]$	\dots	$[M_k]$	\dots
M_1	<u>accept</u>	reject	accept		accept	
M_2	accept	<u>accept</u>	accept	\dots	reject	\dots
M_3	reject	accept	<u>reject</u>		reject	
\vdots		\vdots		\ddots		
M_k	reject	reject	accept			
\vdots		\vdots				\ddots



Self-reference and diagonalisation

inverter of universal decider

Table 5

The cell (k, j) is the outcome of running $V = M_k$ (the inverter of P) on $[M_k[M_j]]$. A contradiction occurs at cell (k, k) .

	$[M_1]$	$[M_2]$	$[M_3]$	\dots	$[M_k]$	\dots
M_1	<u>accept</u>	reject	accept		accept	
M_2	accept	<u>accept</u>	accept	\dots	reject	\dots
M_3	reject	accept	<u>reject</u>		reject	
\vdots		\vdots		\ddots		
M_k	reject	reject	accept		<u>?</u>	
\vdots		\vdots				

$$\mathcal{F} \vdash \gamma \leftrightarrow \neg \text{Provable}_{\mathcal{F}}(\ulcorner \gamma \urcorner)$$





Self-reference and diagonalisation

inverter of universal decider

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The cell (k, j) is the outcome of running $V = M_k$ (the inverter of P) on $[M_k[M_j]]$. A contradiction occurs at cell (k, k) .

	$[M_1]$	$[M_2]$	$[M_3]$	\dots	$[M_k]$	\dots
M_1	<u>accept</u>	reject	accept		accept	
M_2	accept	<u>accept</u>	accept	\dots	reject	\dots
M_3	reject	accept	<u>reject</u>		reject	
\vdots		\vdots		\ddots		
M_k	reject	reject	accept		<u>?</u>	
\vdots		\vdots				

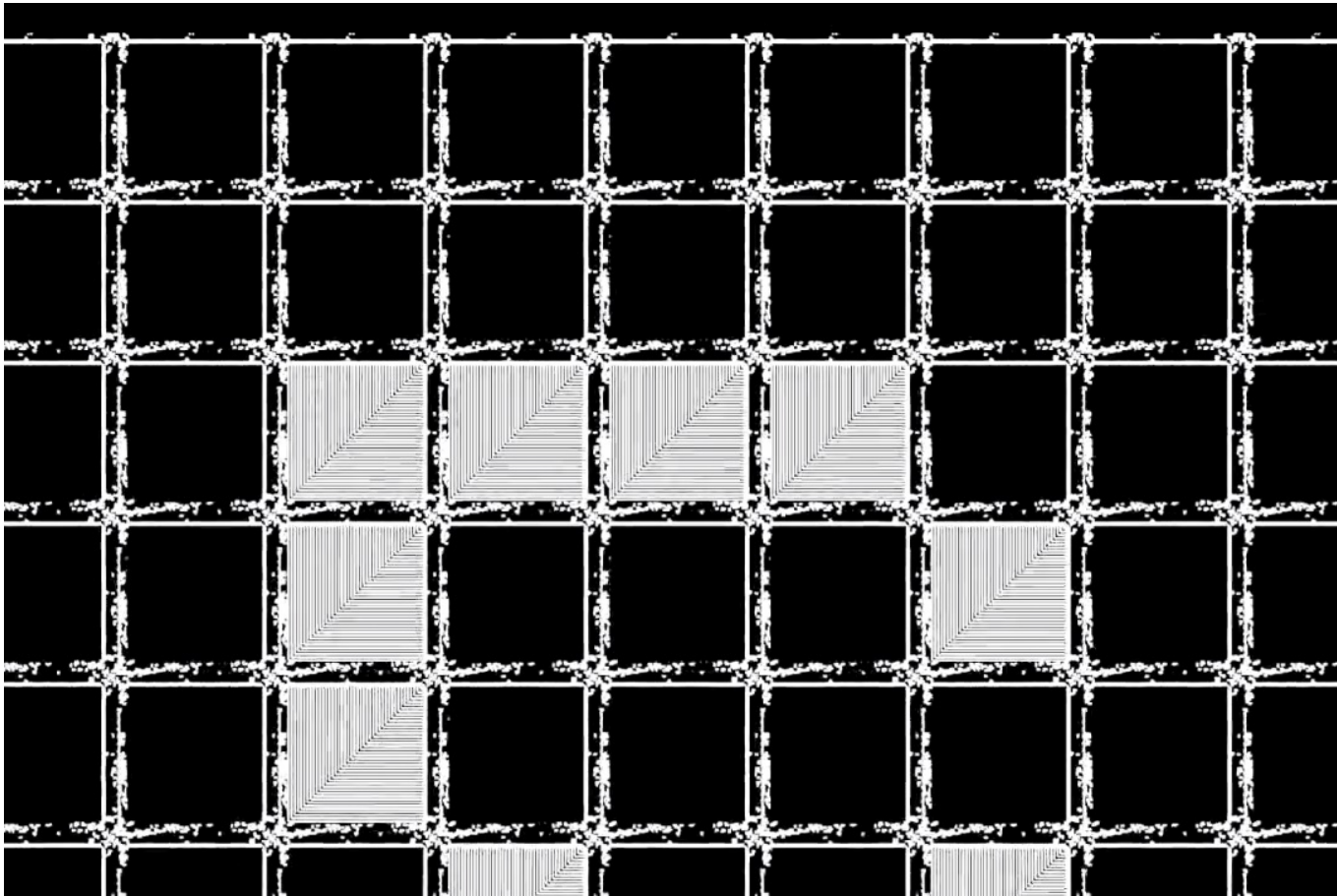
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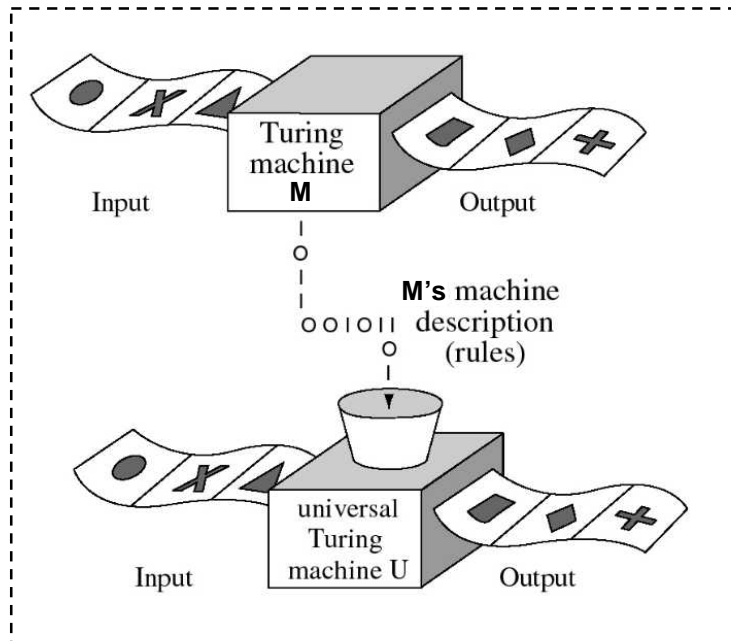
Universal Cellular Automata: a Metapixel



“Life in Life” by Phillip Bradbury: https://www.youtube.com/watch?time_continue=4&v=xP5-ileKXE8
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$$\mathcal{F} \vdash \gamma \leftrightarrow \neg \text{Provable}_{\mathcal{F}}(\ulcorner \gamma \urcorner)$$



- recursive formal systems, Turing machines and Cellular Automata are deeply related
 - these frameworks can produce universal computation and generate undecidable dynamics
 - undecidability is generated by self-reference, infinite computation and negation
 - computational novelty can be created by agents using the diagonalization argument
 - complex systems **are** dynamical systems with undecidable dynamics
-

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