# Self-reference and Evolution of Evolvability

Collaborators: Michael Harré, Joseph T. Lizier, Fabio Boschetti, Pavlos Peppas, Stuart Kauffman, Adam Svahn, Emanuele Crosato, Ramil Nigmatullin, Richard E. Spinney, Matthew Chadwick, Daniel Polani

Prof. Mikhail Prokopenko
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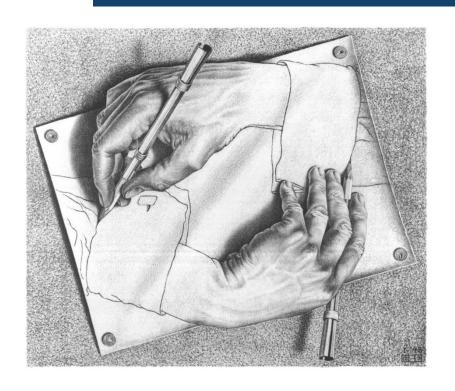


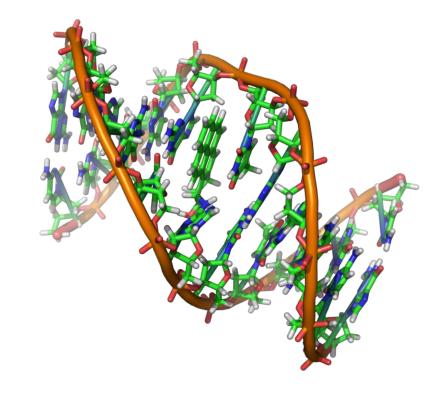


- Self-reference and "tangled hierarchies"
- The halting problem and The Liar paradox
- Edge of chaos, criticality and phase transitions
- Meta-simulation and novelty generation
- Emergence of functional self-descriptions



#### Self and a functional description of "self"



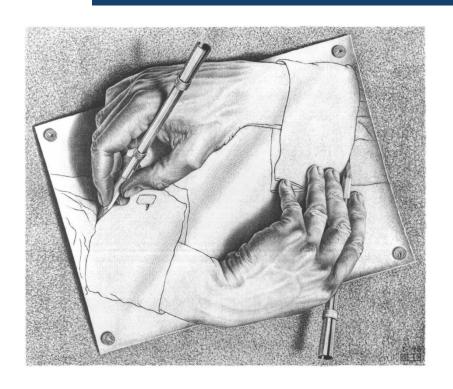


Drawing Hands: the product, the hands, are undertaking the operation – the drawing of the hands

DNA: genetic instructions (sequence) used in development and functioning of a living organism (function and 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

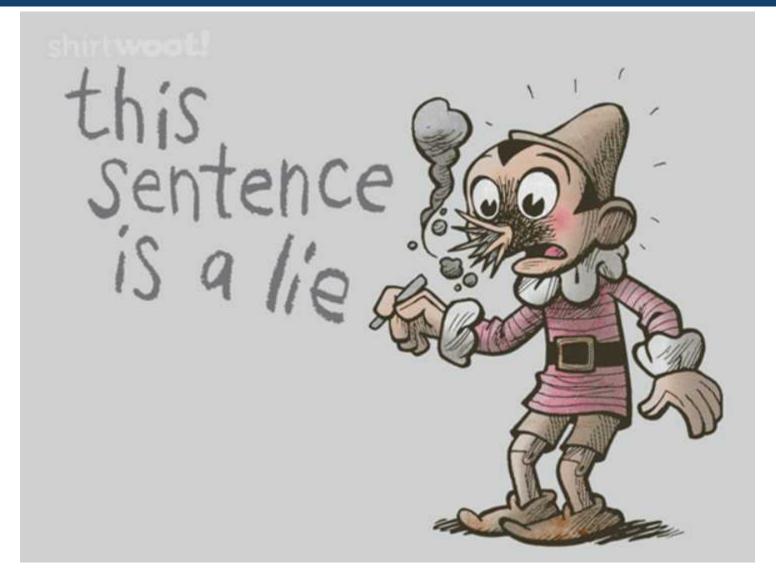
#### El Farol Bar Problem:

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

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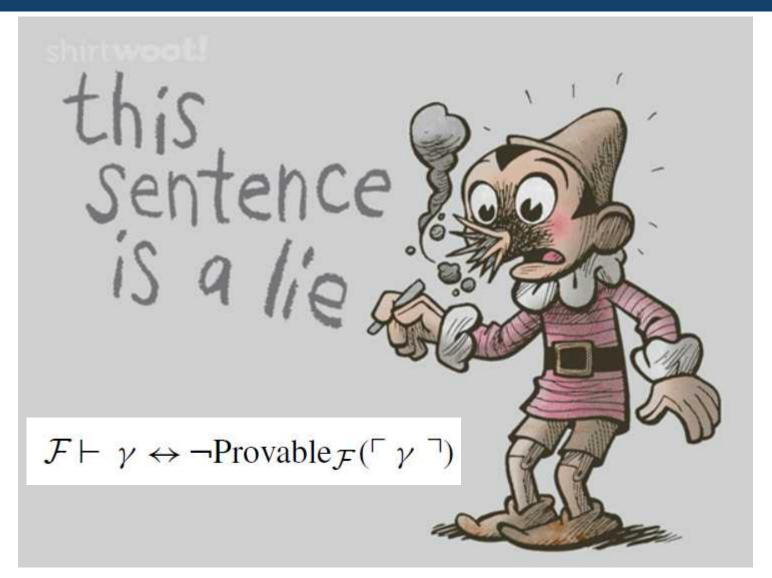


### The Liar paradox





#### The Liar paradox



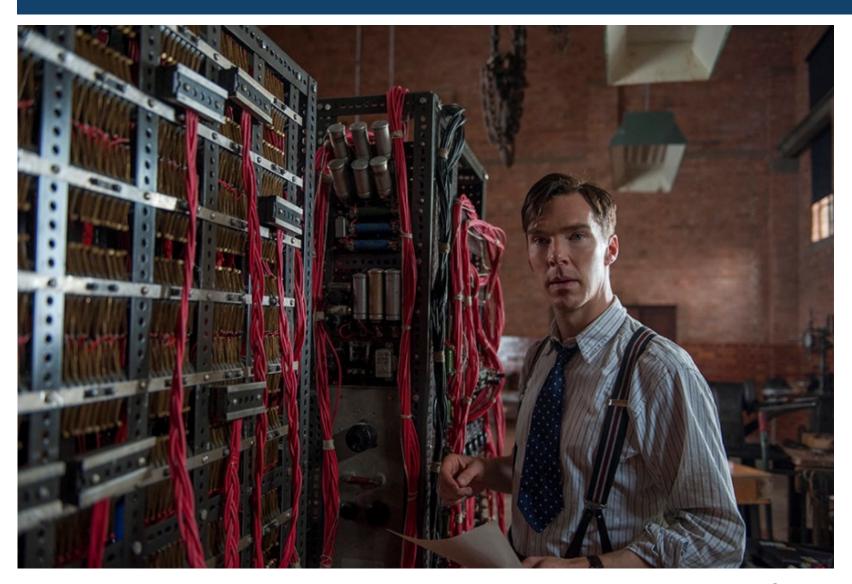




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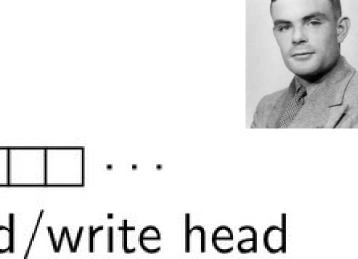
# Turing Machine (...not that one)

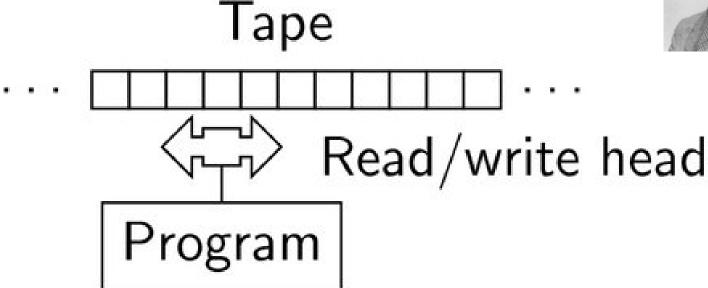


The Imitation Game, 2014



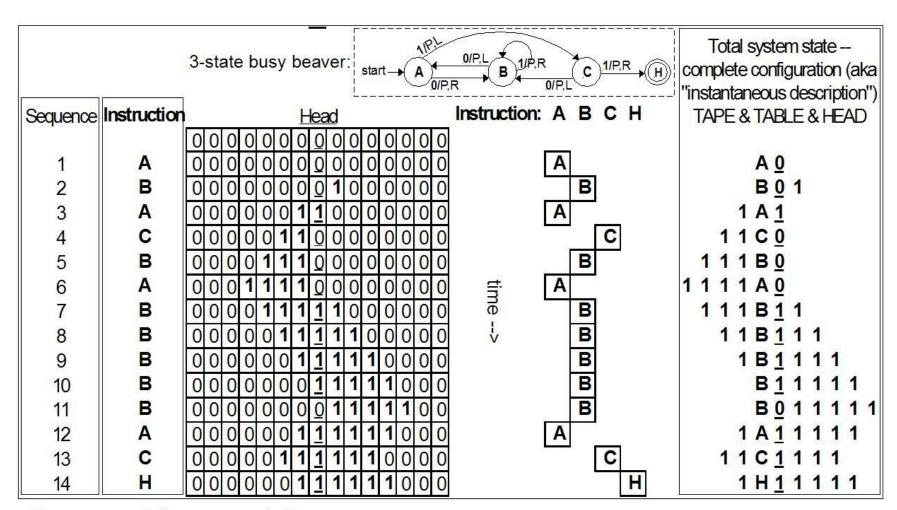
### **Turing Machine**







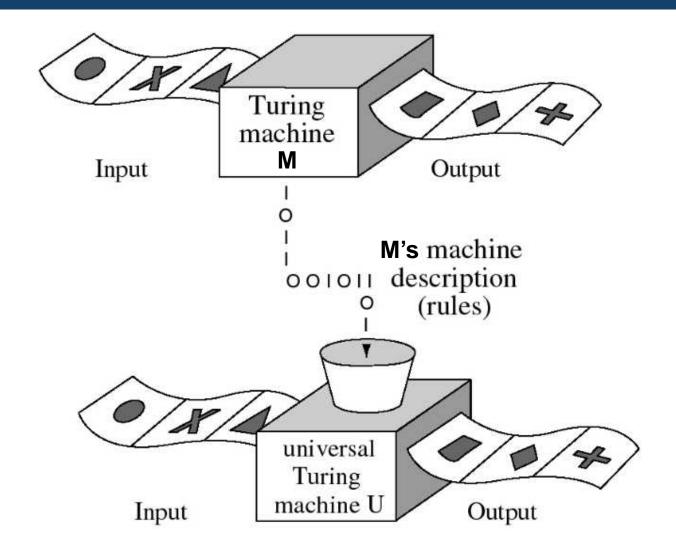
#### **Turing Machine**



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?

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

M. Prokopenko, M. Harré, J. Lizier, F. Boschetti, P. Peppas, S. Kauffman, Self-referential basis of undecidable dynamics: from The Liar Paradox and the halting Problem to the edge of chaos, *Physics of Life Reviews*, 31: 134-156, 2019.



# Universal Decider Turing Machine: does it exist?

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

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



# Universal Decider Turing Machine: does not exist!

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

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

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





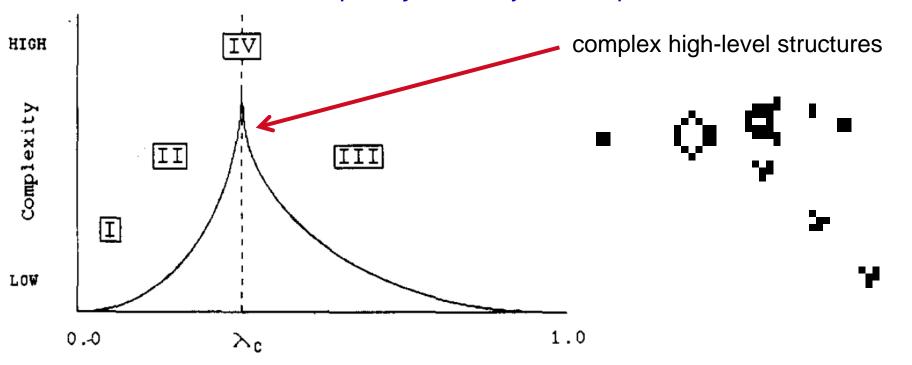
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### Motivation: dynamics of computation

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

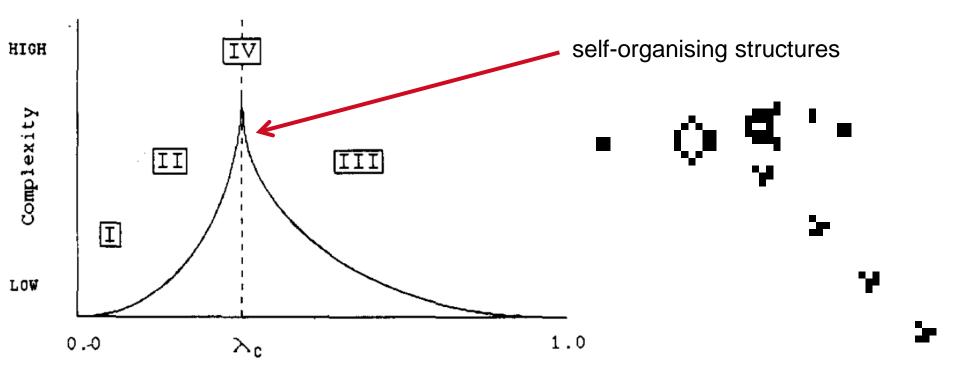
- how can emergence of computation be explained in a *dynamic* setting?
- how is it related to *complexity* of the system in point?





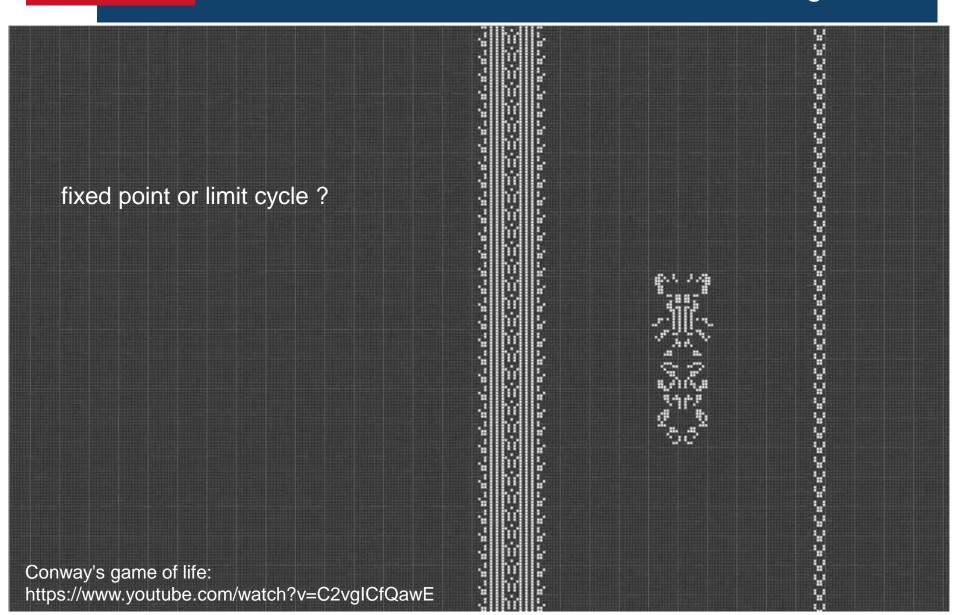


- 1. Deaths. Any live cell with fewer than two or more than three live neighbours dies.
- 2. Survivals. Any live cell with two or three live neighbours lives on to the next generation.
- 3. Births. Any dead cell with exactly three live neighbours becomes a live cell.



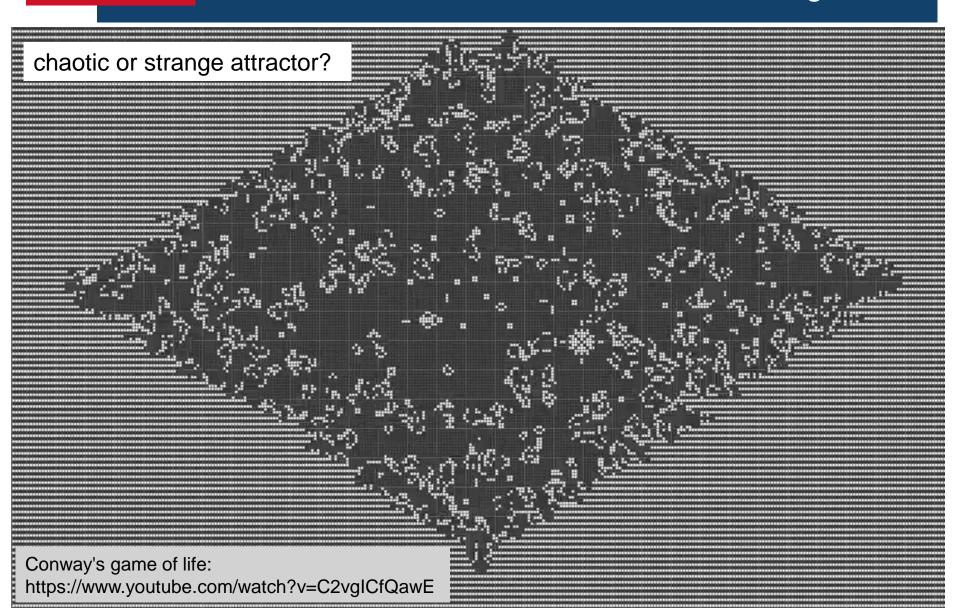


### Game of Life: convergence?



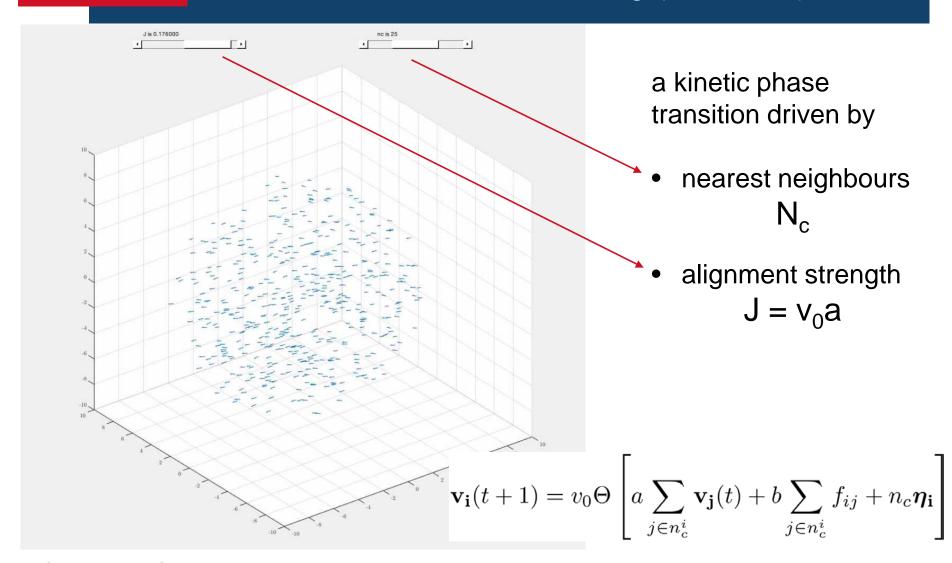


## Game of Life: convergence?



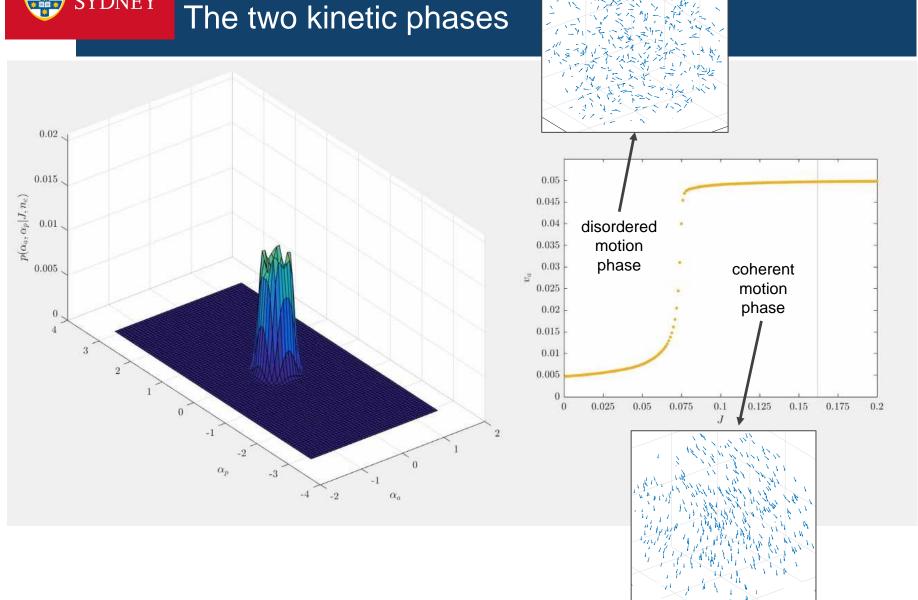


#### Swarming (collective) motion



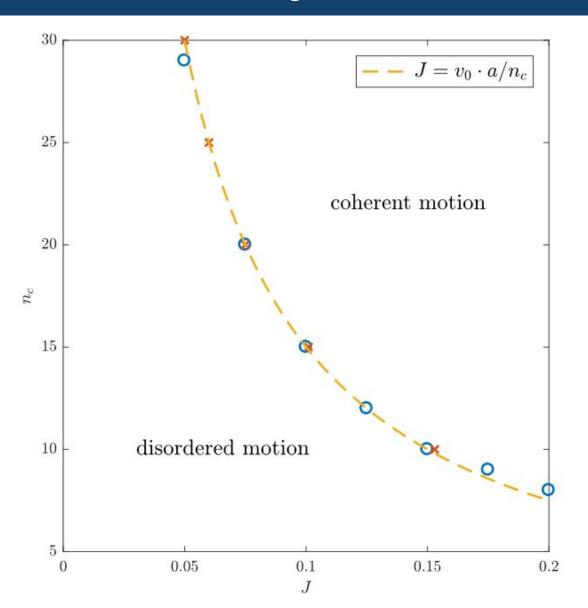
E. Crosato, R. Spinney, R. Nigmatullin, J. T. Lizier, M. Prokopenko, Thermodynamics of collective motion near criticality, *Physical Review E*, 97, 012120, 2018.







### Edge of chaos in collective motion



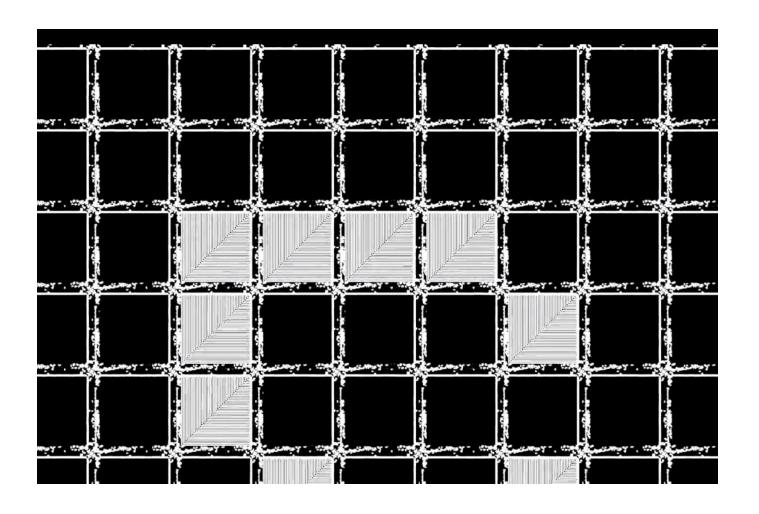




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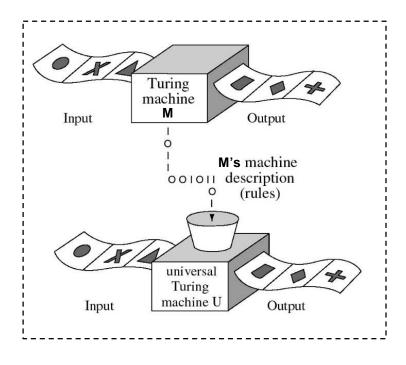
#### Universal Cellular Automata: a Metapixel

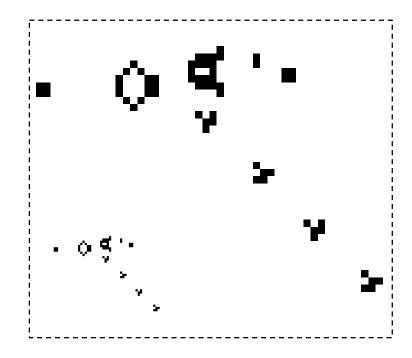




#### Three-way equivalence

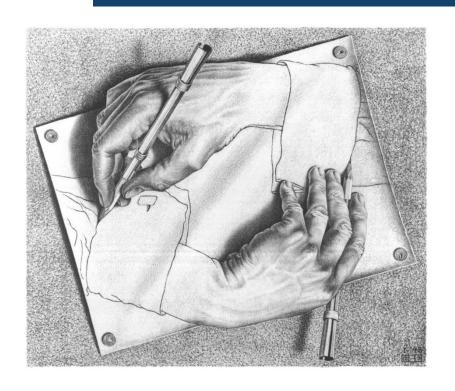
$$\mathcal{F} \vdash \gamma \leftrightarrow \neg \text{Provable}_{\mathcal{F}}(\lceil \gamma \rceil)$$

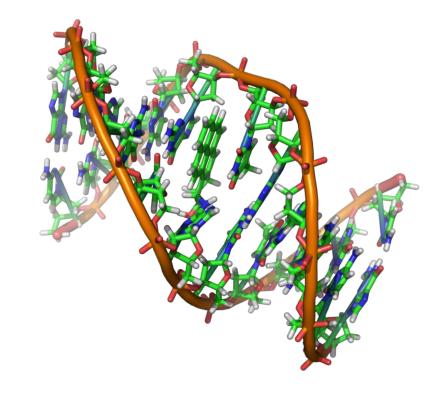






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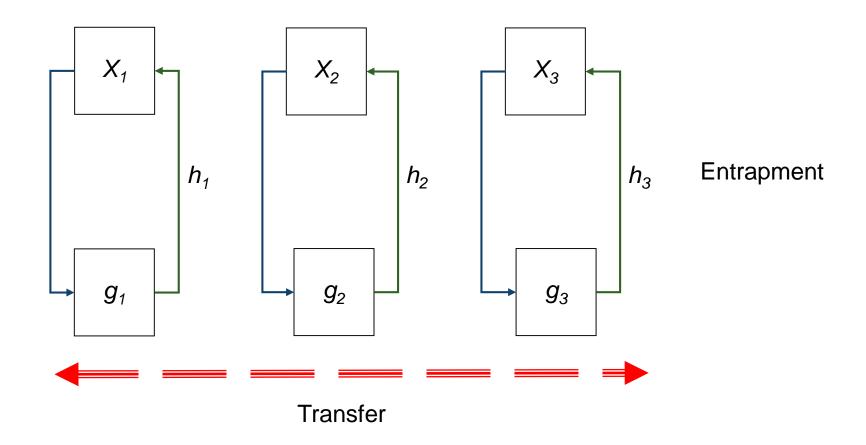


### Coding threshold

- genotype-phenotype mapping: a self-referential relationship between an encoded description of a living organism (data) and the organism itself (program)
- "how the genotype-phenotype relationship had come to be?"
- how a functional self-description ("encoding") could evolve?
- "Coding threshold" separates an earlier evolutionary stage and the RNA world with the capacity to represent nucleic acid life symbolically, in terms of amino acid sequences



#### Entrapment and Horizontal Gene Transfer



M. Prokopenko, D. Polani, M. Chadwick. Stigmergic gene transfer and emergence of universal coding, *HFSP Journal*, 3(5): 317-327, 2009.

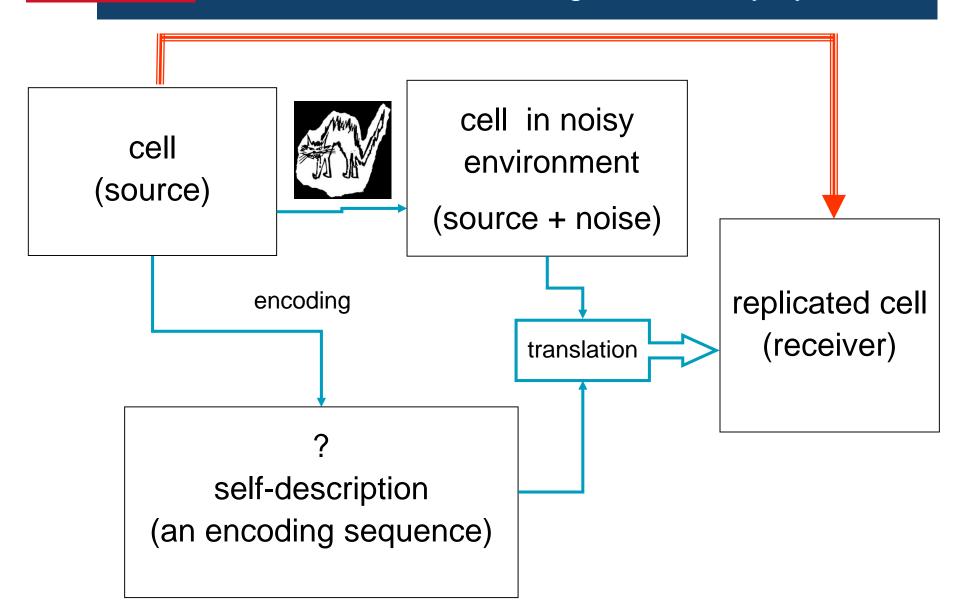


#### Selection pressure: information preservation

- how a functional self-description ("encoding") could evolve?
- hypothesis: maximisation of information preservation through selected channels is one of the main evolutionary pressures
- information preservation is a consistent motif in biology:
  - evolution extracts valuable information and stores it in the genes
  - this process is relatively slow and noisy
  - → a selective advantage: to preserve this information, once captured



#### Modelling evolutionary dynamics





## Objective (fitness) function

$$m{g}^{ extbf{max}} I_g(X_{t_0}; X_{t^*})$$

$$m{min}_{m{g}} \ d(X_{t_0}, X_{t^*}) = H(X_{t_0}|X_{t^*}) + H(X_{t^*}|X_{t_0})$$

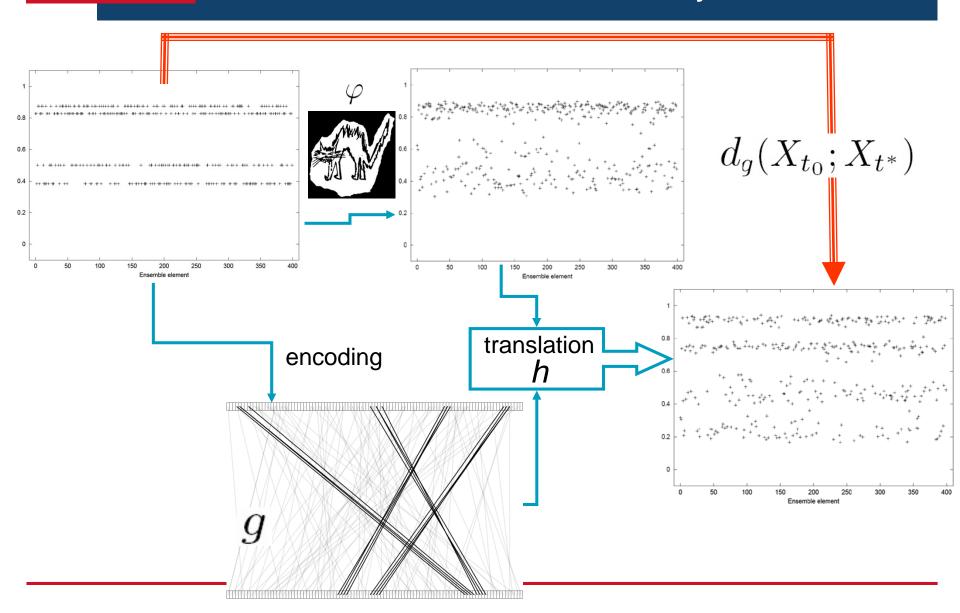
subject to





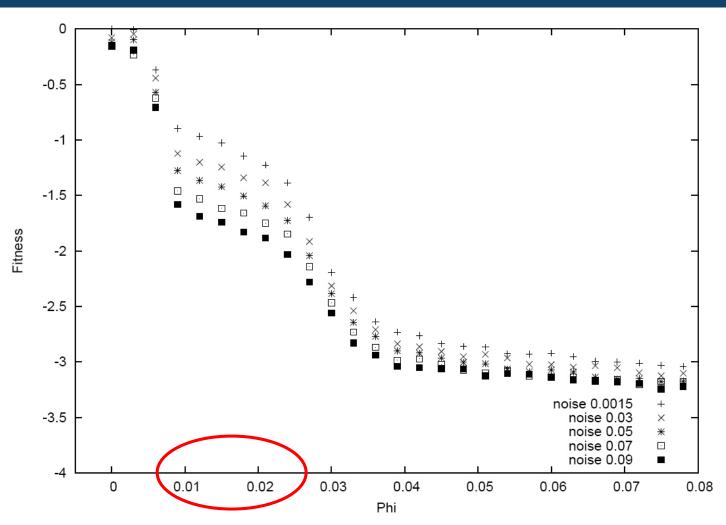


# Recovery of structure





## "Error interval"



Fitness d over external noise

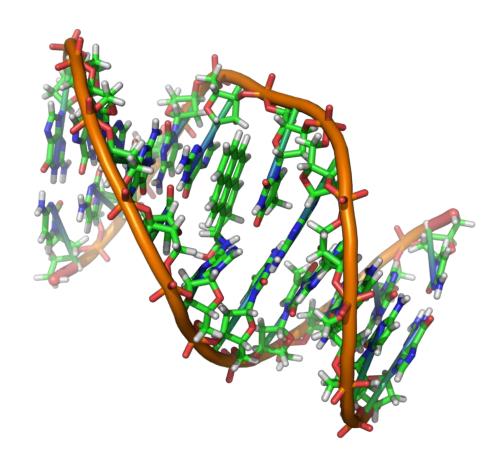




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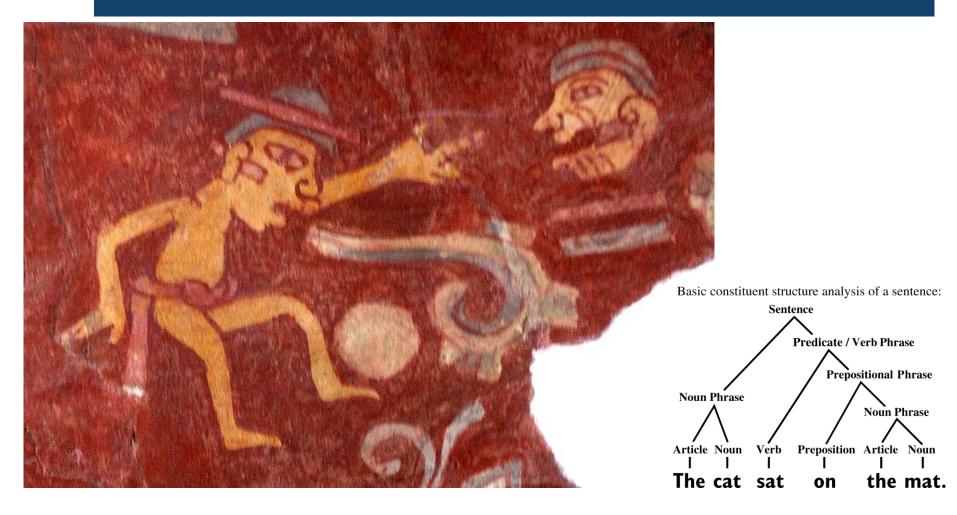
#### Genetic code: a functional self-description



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



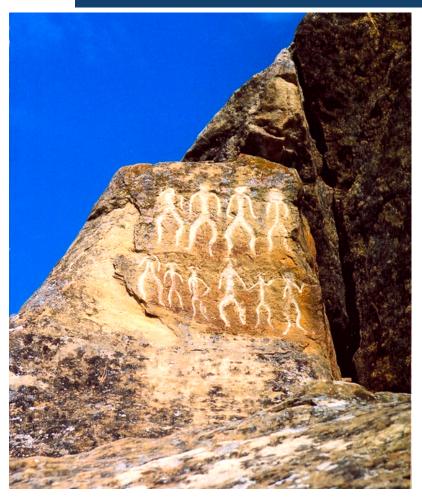
#### Language: a functional self-description



Speech, language, grammar. A mural in Teotihuacan, Mexico (c. 2nd century) depicting a person emitting a speech scroll from his mouth, symbolizing speech



#### Culture: a functional self-description



Culture: Petroglyphs in modern-day Gobustan, Azerbaijan, dating back to 10,000 BCE



The Tower of Babel by Pieter Bruegel the Elder, 1563.





- universal computation and undecidable dynamics
- undecidability is generated by self-reference, infinite computation and negation
- computational novelty can be created by agents with universal computation and functional self-description
- information preservation via functional self-description drives novelty generation across major transitions (genetic, linguistic, cultural)
- complex systems are dynamical systems with undecidable dynamics



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HFSP Journal

ARTICLE

# Stigmergic gene transfer and emergence of universal coding

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(Submit 10 April 2009; accepted 21 June 2009; published online 6 August 2009)

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#### PHYSICAL REVIEW E 97, 012120 (2018)

#### Thermodynamics and computation during collective motion near criticality

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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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