

 **AUGUST 21 ON YOUTUBE LIVE**

CROSS ROADS #15

# Bert Chan

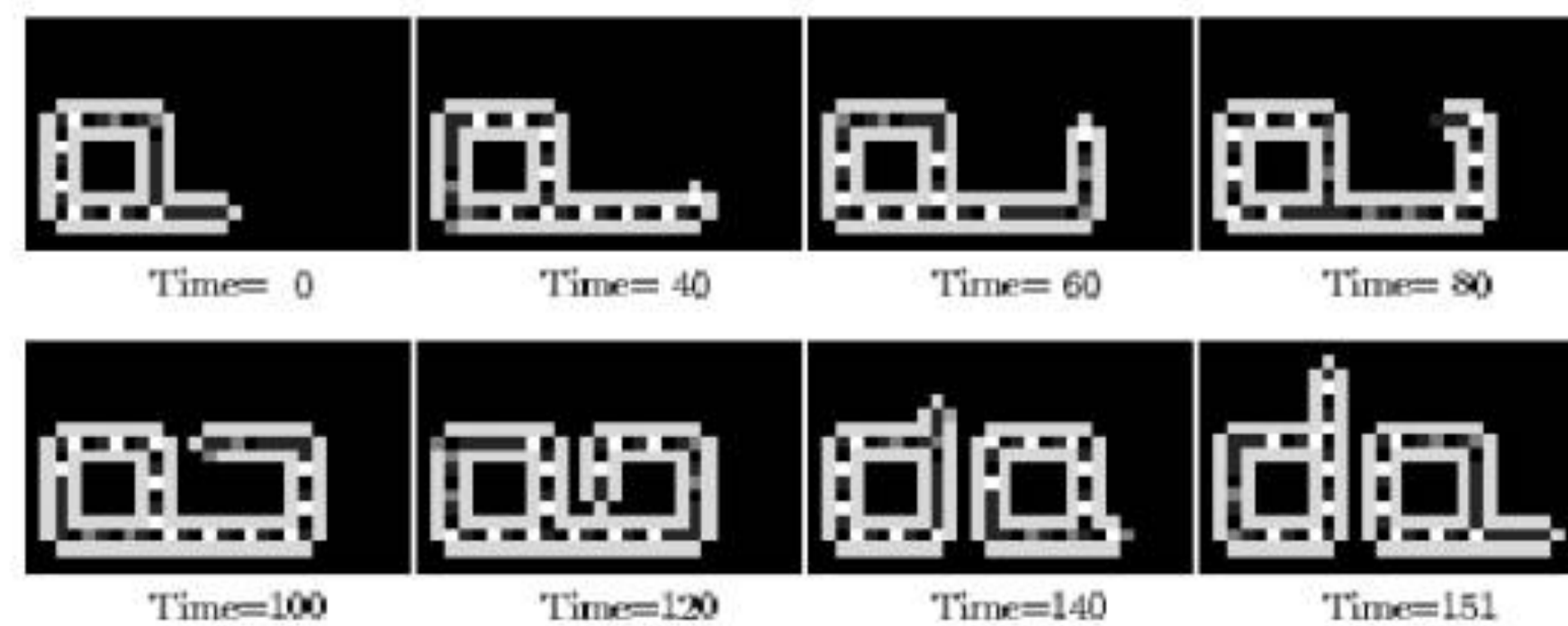
Independent Researcher (Hong Kong)

Lenia, Life, and Intelligence

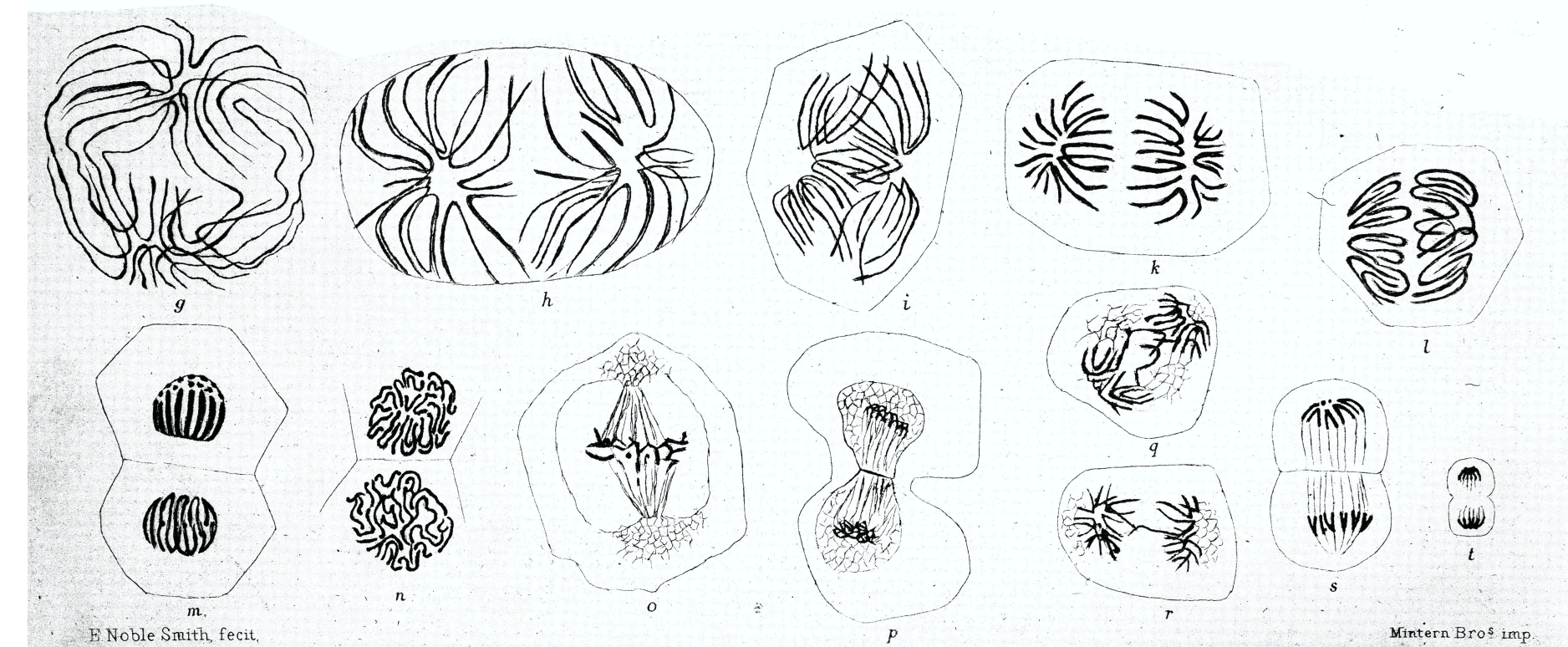
**AUGUST 21, 2020, 9:30PM JST**

# This talk

- Use **Lenia** as example on...
  - How to create **artificial life**
  - Characteristics of **biological life** and **artificial life**
  - Relationships between **artificial life** and **artificial intelligence**



Langton's Ant

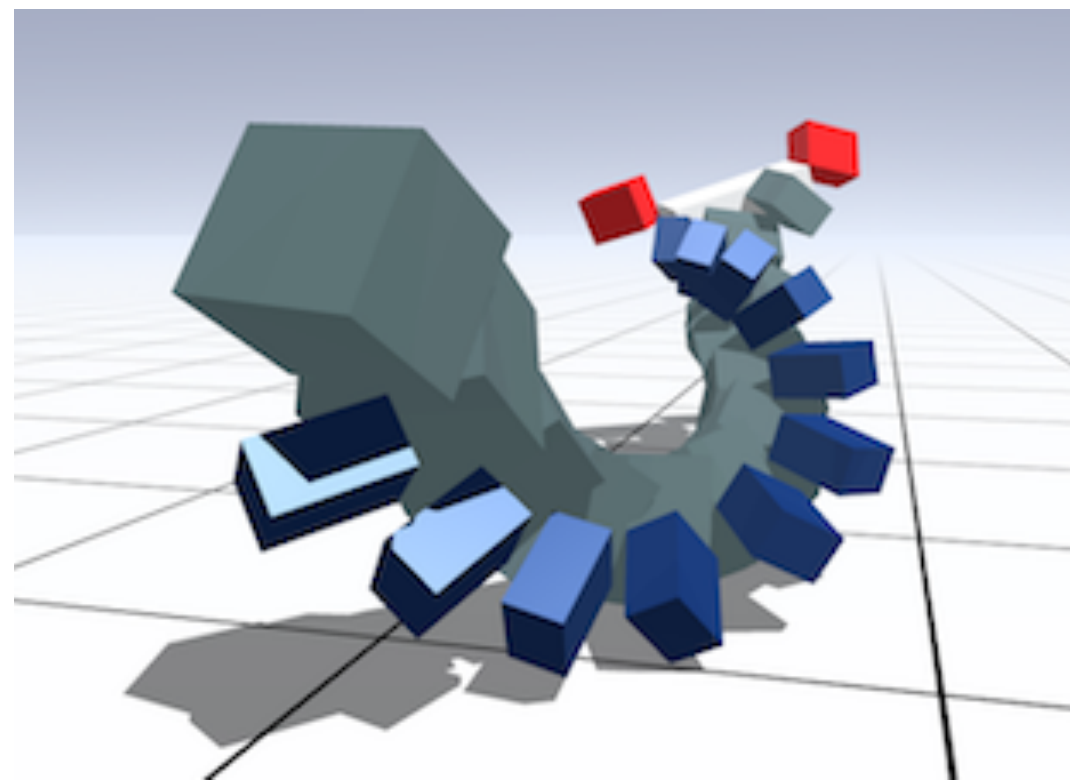
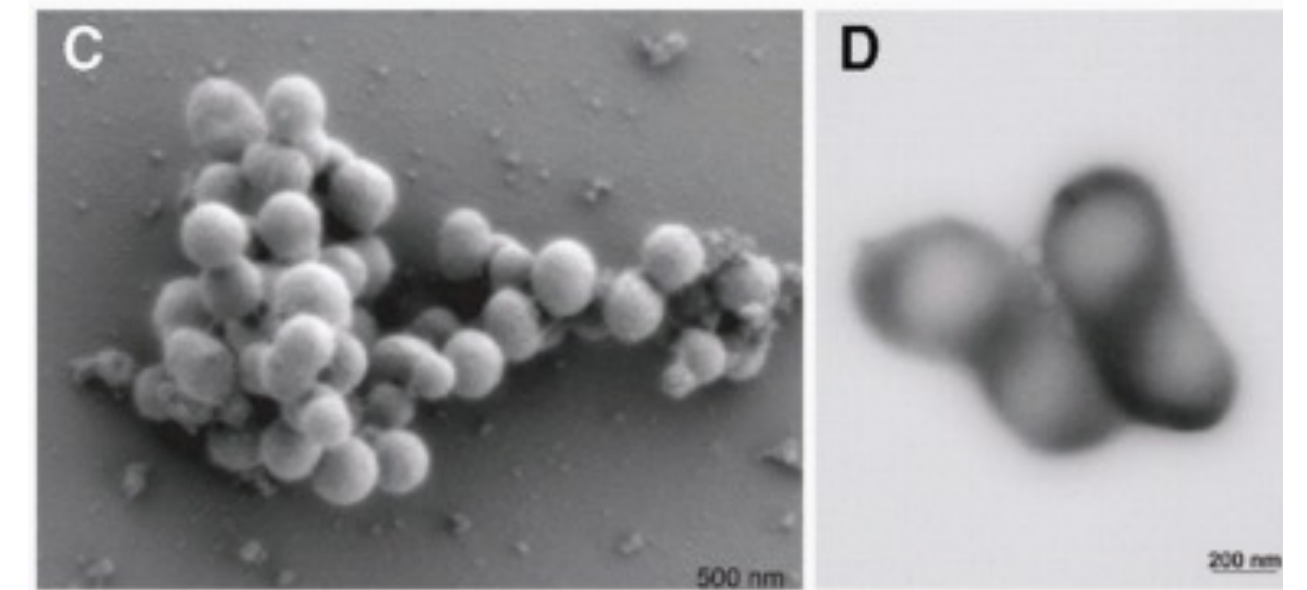
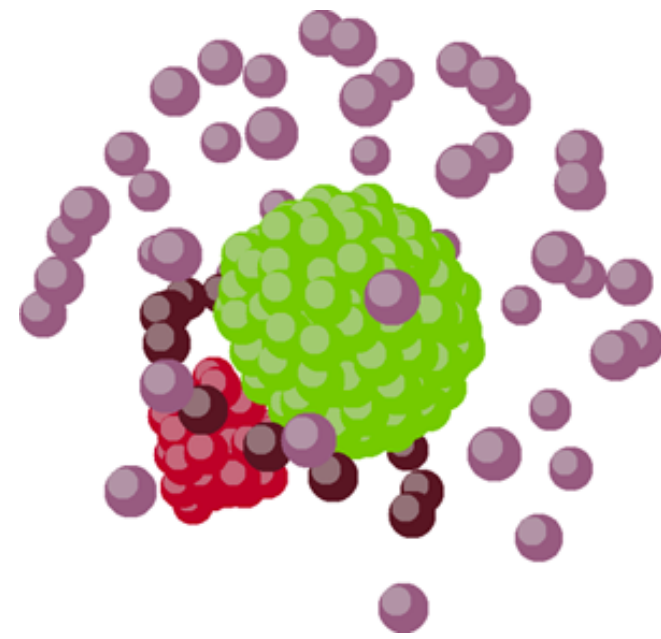


Cell division

# How to create life

# Artificial Life (ALife)

- **Simulate or create life forms** to answer “What is life?”, “What life can be?”



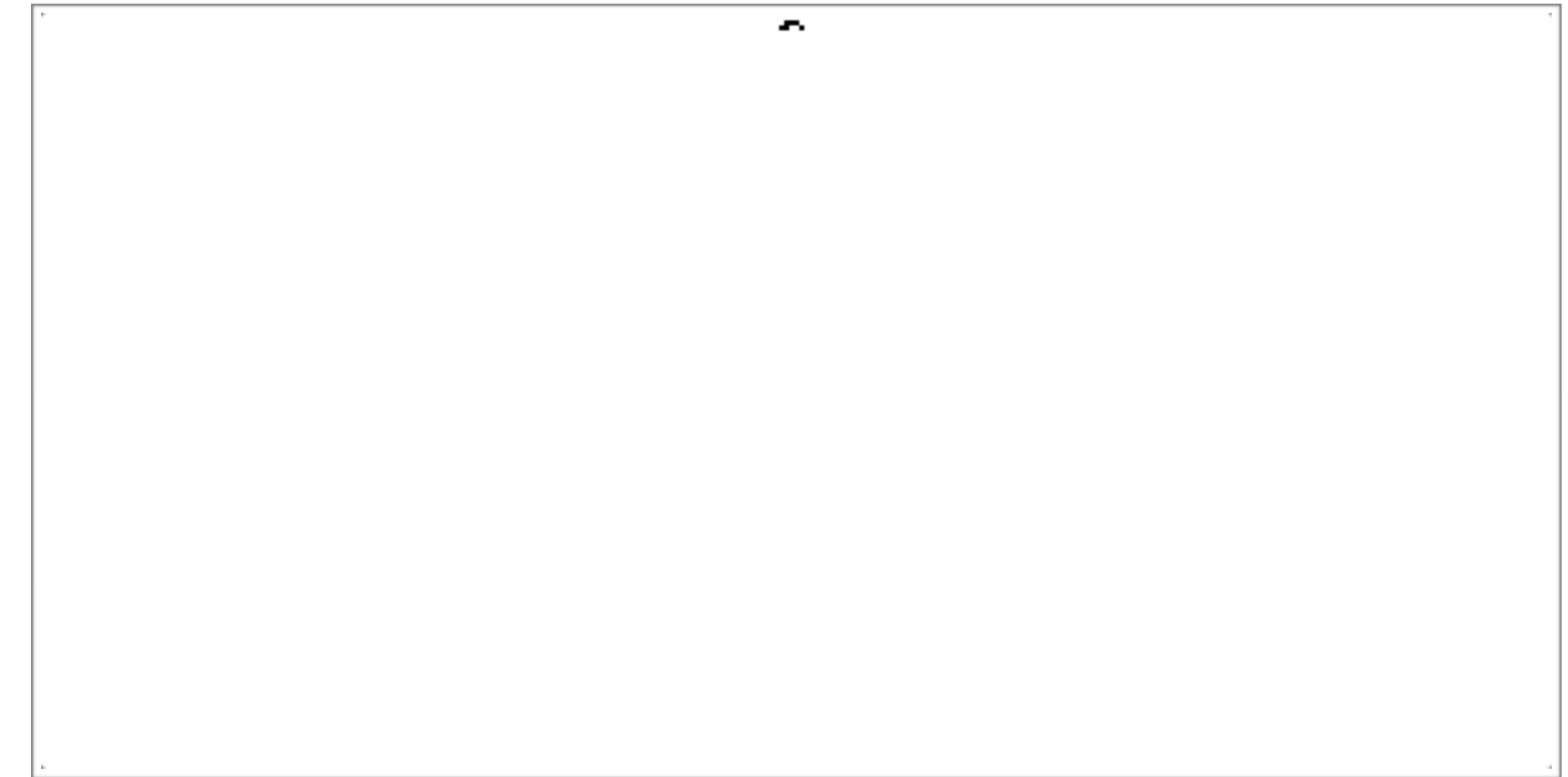
**Software ALife**  
swarm chemistry, virtual creature

**Hardware ALife**  
Spot & Atlas, Strandbeest

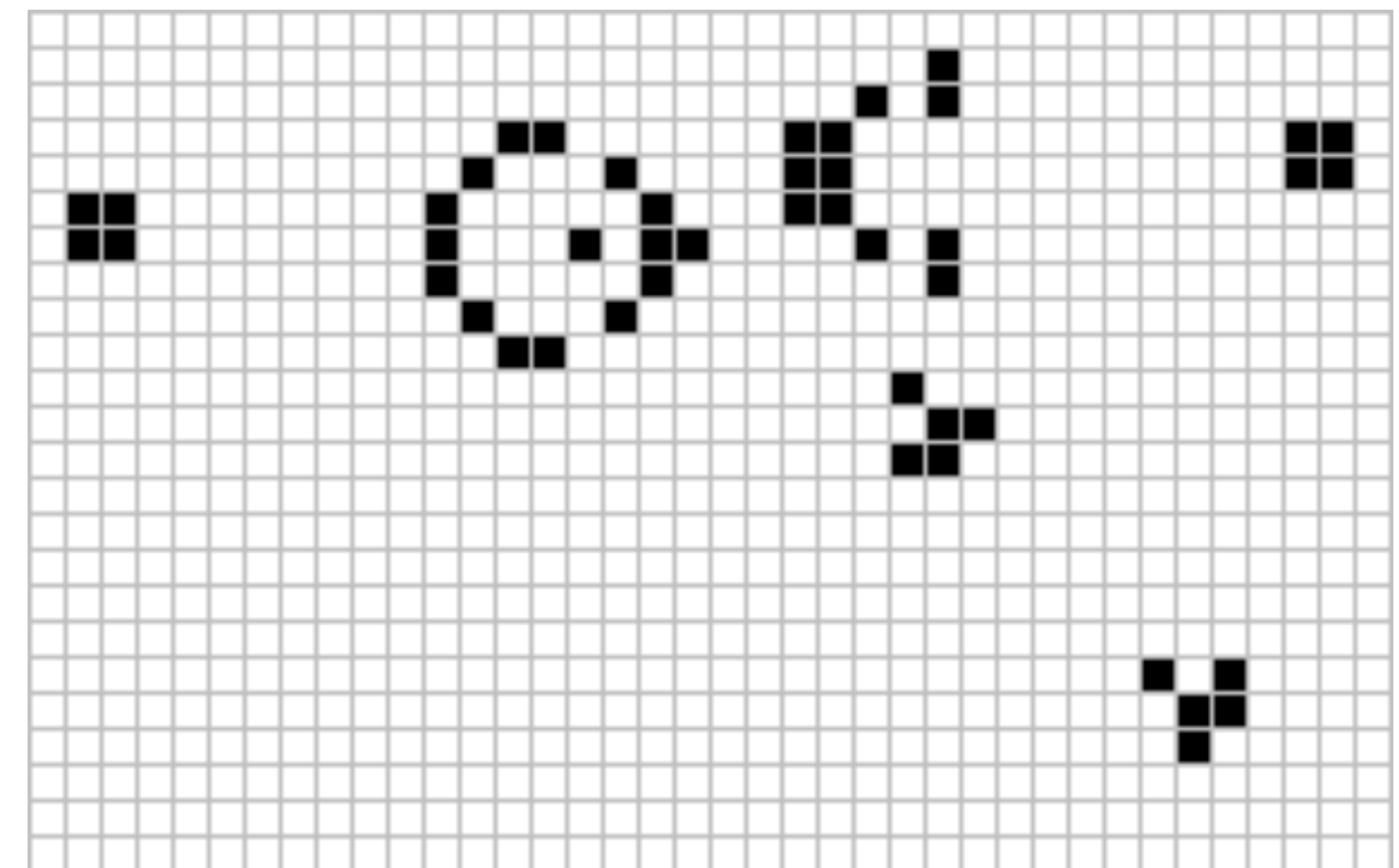
**Wetware ALife**  
Synthia, Xenobot

# Cellular Automata

- n-Dimensional **grid**
  - Each site has **discrete state**
  - Next state determined by **neighborhood**
  - Whole grid **updated** repeatedly
- Examples: ECA [S Wolfram], GoL [JH Conway]
- Generate interesting **patterns**, even a **computer**
- Used to **model** physical, chemical, social complex systems



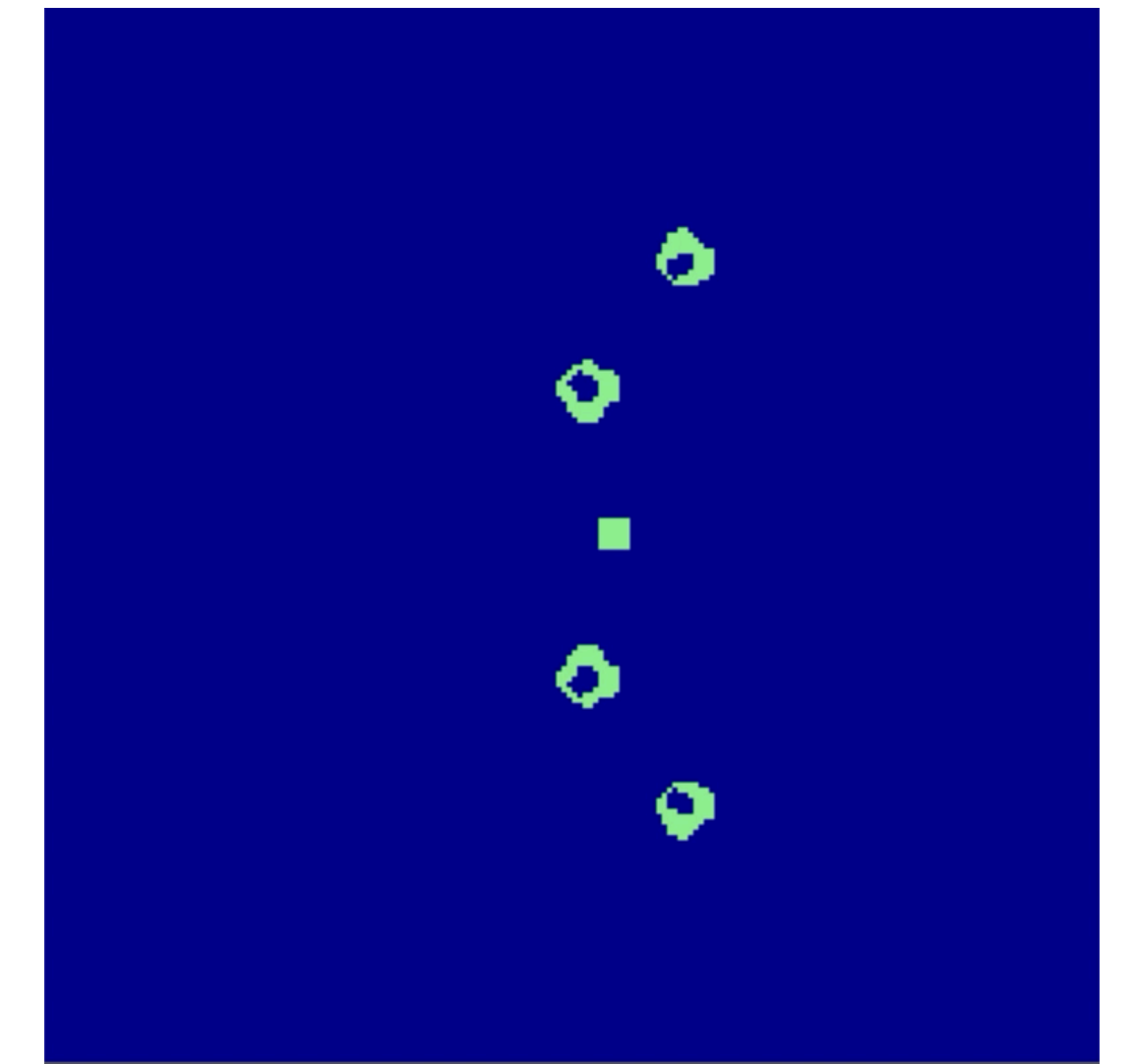
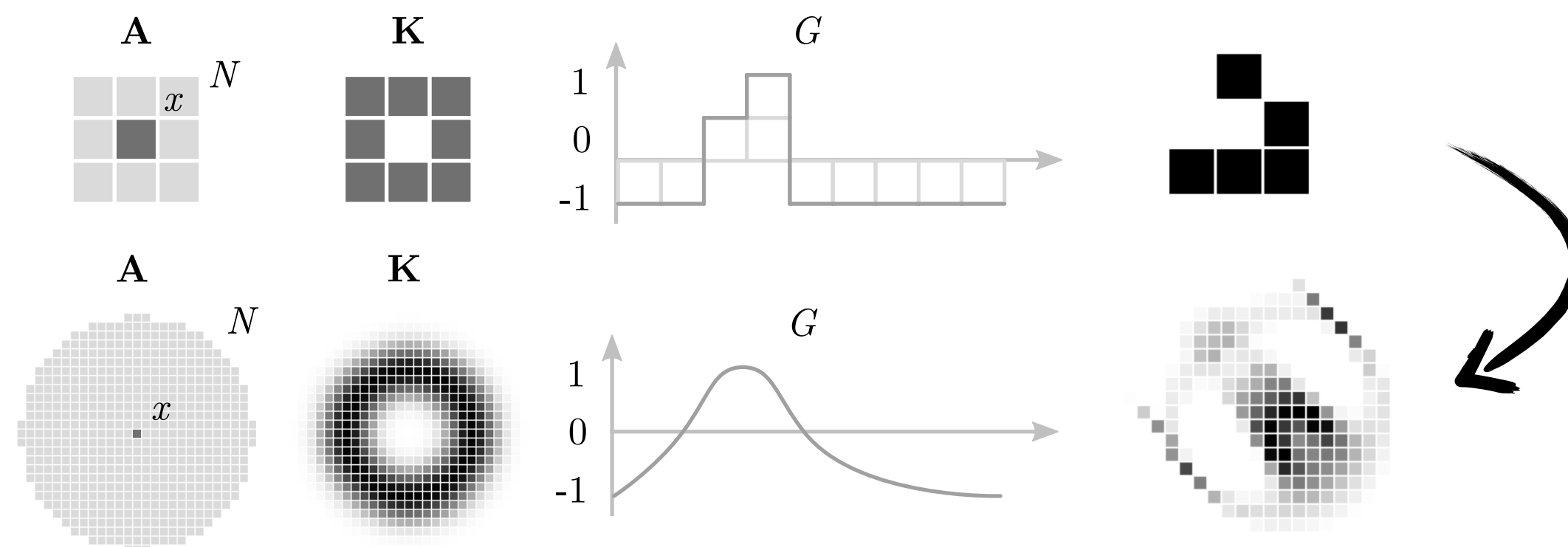
elementary cellular automata



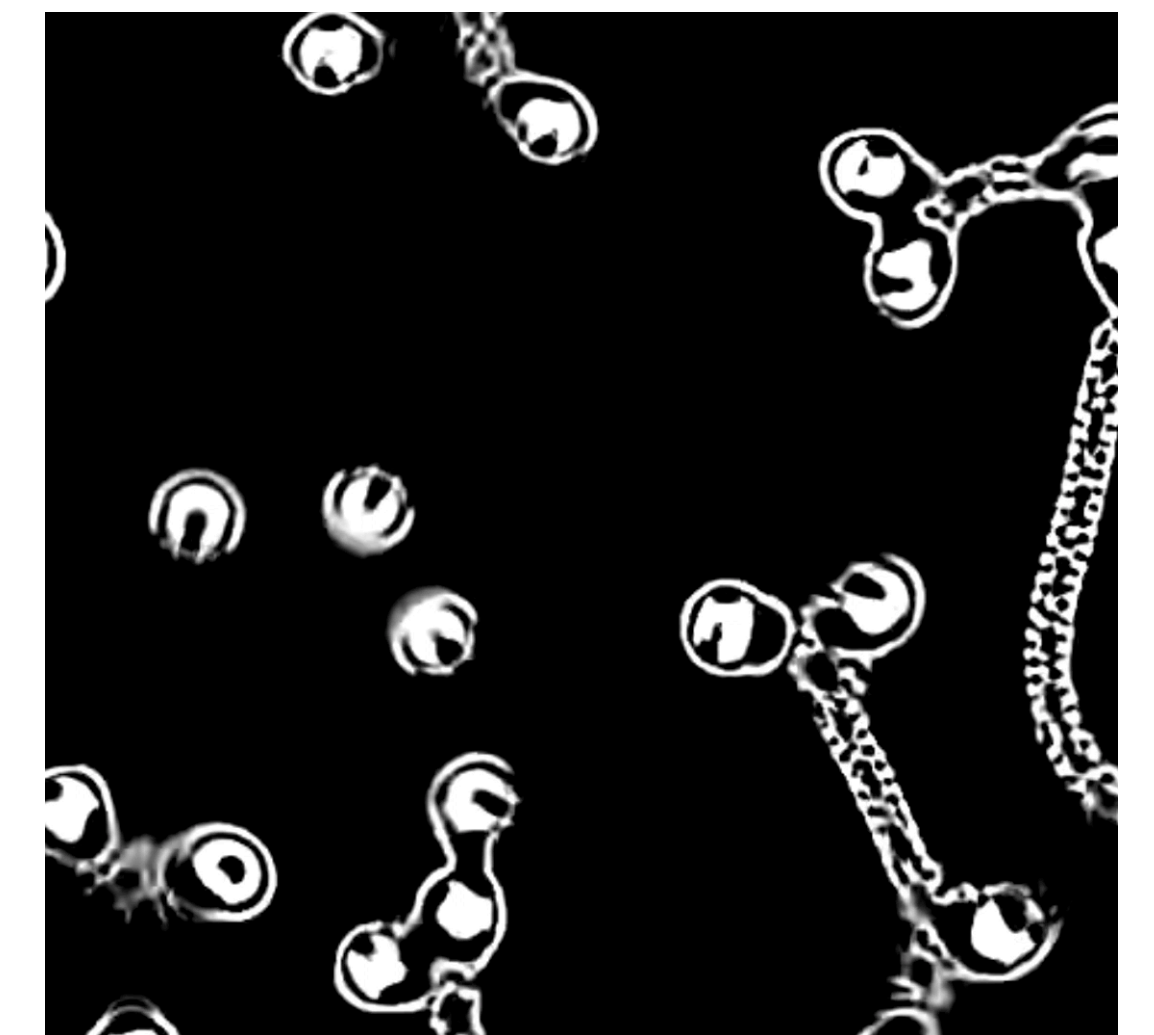
glider gun in Game of Life

# Continuous CA

- From discrete to continuous by:
  - Real values (**continuous states**)
  - Larger neighborhood (**continuous space**)
  - Incremental updates (**continuous time**)
- Examples: LtL [KM Evans], SmoothLife [S Rafler], Lenia
- Generate **geometric lifelike patterns**



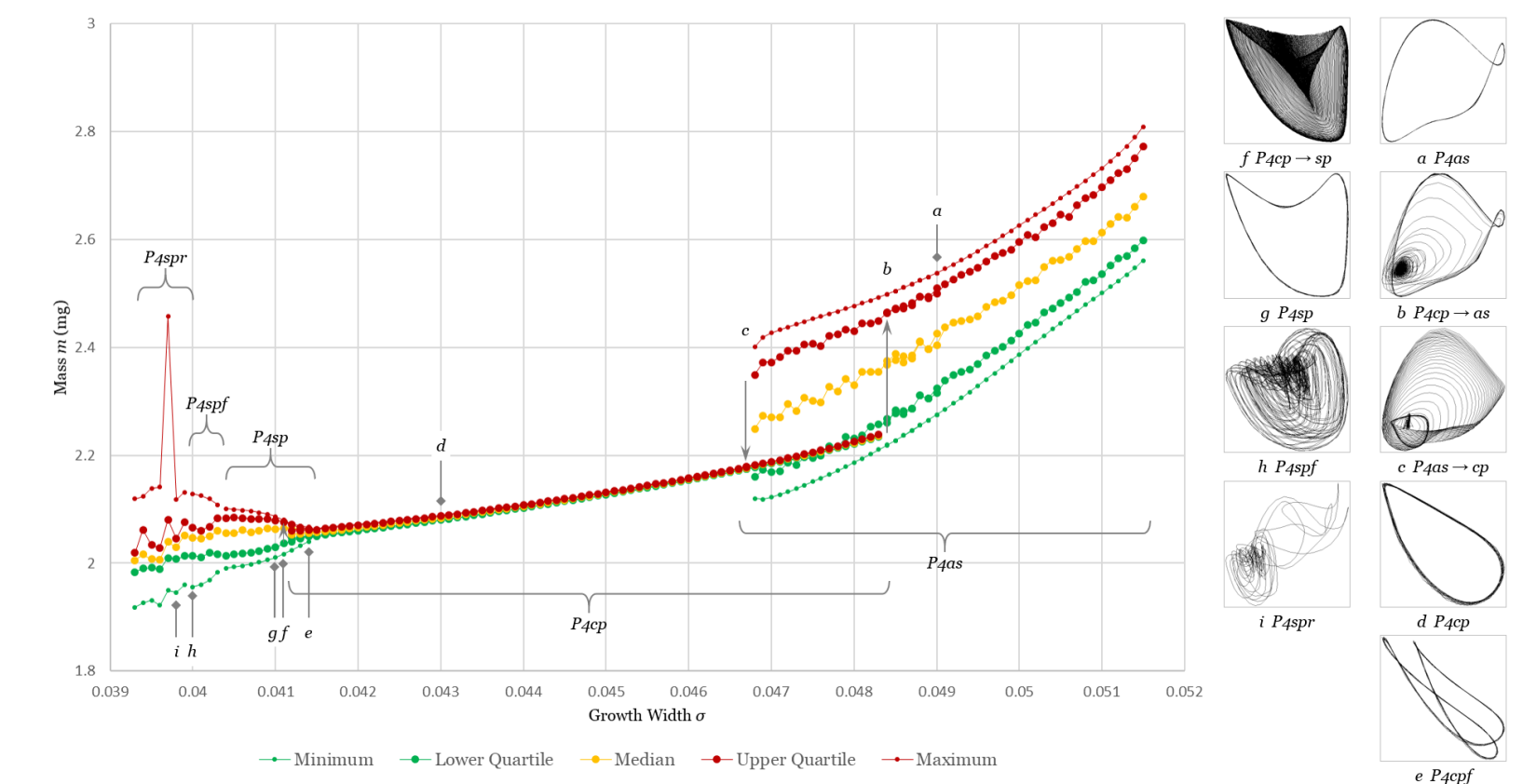
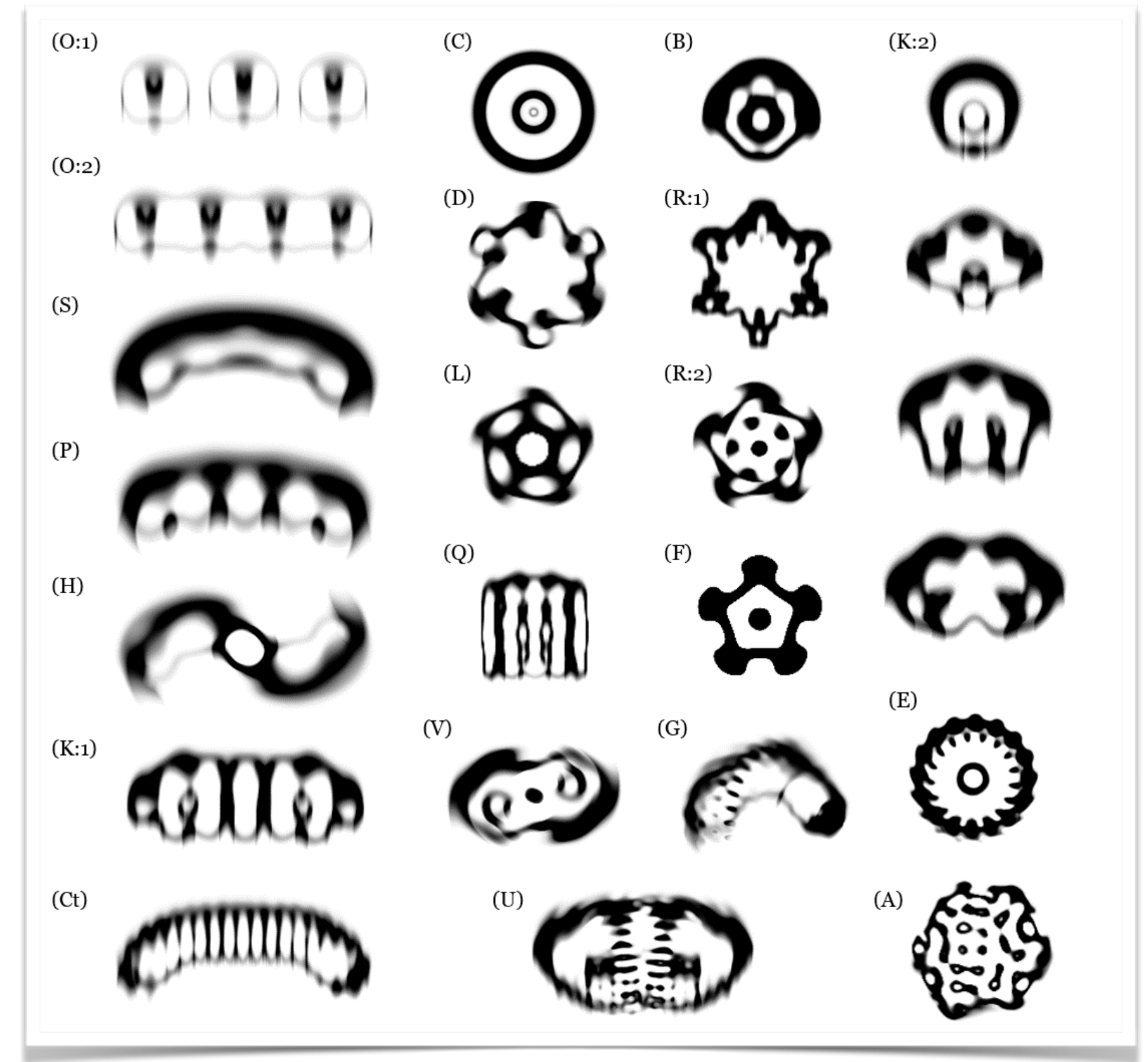
glider gun in Larger-than-Life



SmoothLife

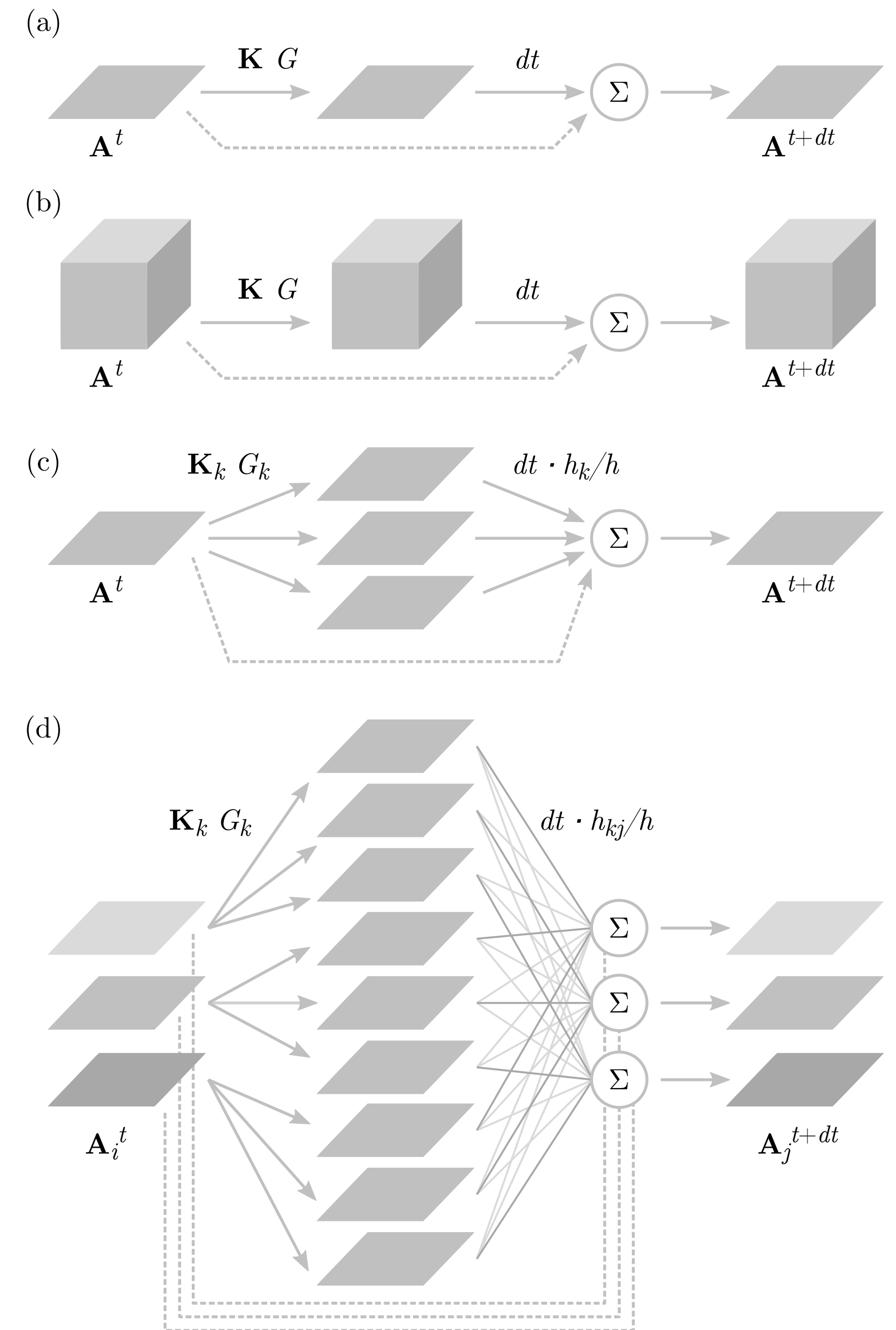
# Lenia (2015)

- Further generalize the rule:
  - Convolution with **kernel**
  - Update using **smooth mapping**
- Highly **diverse** lifeforms (400+ species)
  - **Symmetric** structures & **regular** dynamics
  - Qualitative & quantitative studies
- Video — ALIFE 2018 Tokyo
- Paper — *Complex Systems*



# Extended Lenia (2019)

- Further extensions:
  - 2D  $\rightarrow$  3D or **higher dimensions**
  - Single neighborhood  $\rightarrow$  **multiple kernels**
  - Single grid  $\rightarrow$  **multiple channels**
- Exploding diversity
  - More **irregular** but **robust** lifeforms, more interesting phenomena
- Paper & Video — ALIFE 2020 Montreal





# Characteristics of ALife systems

# Complex Systems

- = system composed of **many interacting components**
- Characteristics: complexity, nonlinearity, self-organization, emergence, networks, dynamical, adaptation
  - **Complexity** = behaviors not easily inferred from system properties
  - **Nonlinearity** = *“the whole is **more than** the sum of its parts”*
- Examples: snow flakes, cities, ant colonies, many **ALife systems** (e.g. Lenia), **biosphere** (life), **brain** (intelligence)
  - Study one, know others better

# Self-Organization

- = **spontaneous global order** arise from local interactions of components
- Characteristics:
  - Spatio-temporal patterns
  - Decentralized, distributed
  - Robust, self-repair from perturbations
- “**Anti-chaos**” = complex interactions → simple patterns
  - vs. chaos = simple interactions → complex patterns

# Emergence

- = **irreducible property** arise from local interactions of components
- Characteristics:
  - Impossible to predict
  - “*The whole is ~~more~~ **other than** the sum of its parts*”
- Example: H (explosive gas) + O (burning gas) → H<sub>2</sub>O (stable liquid)

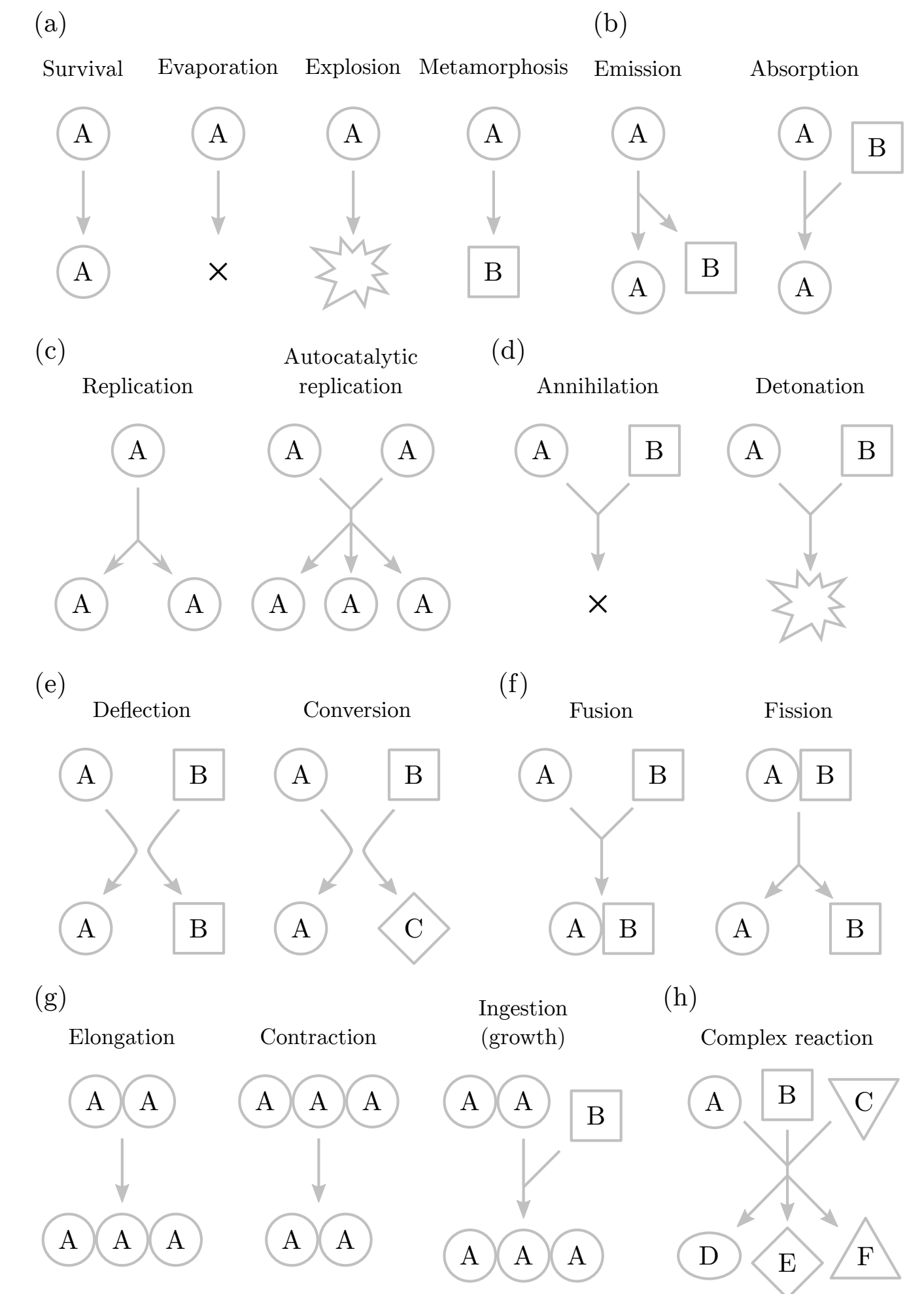
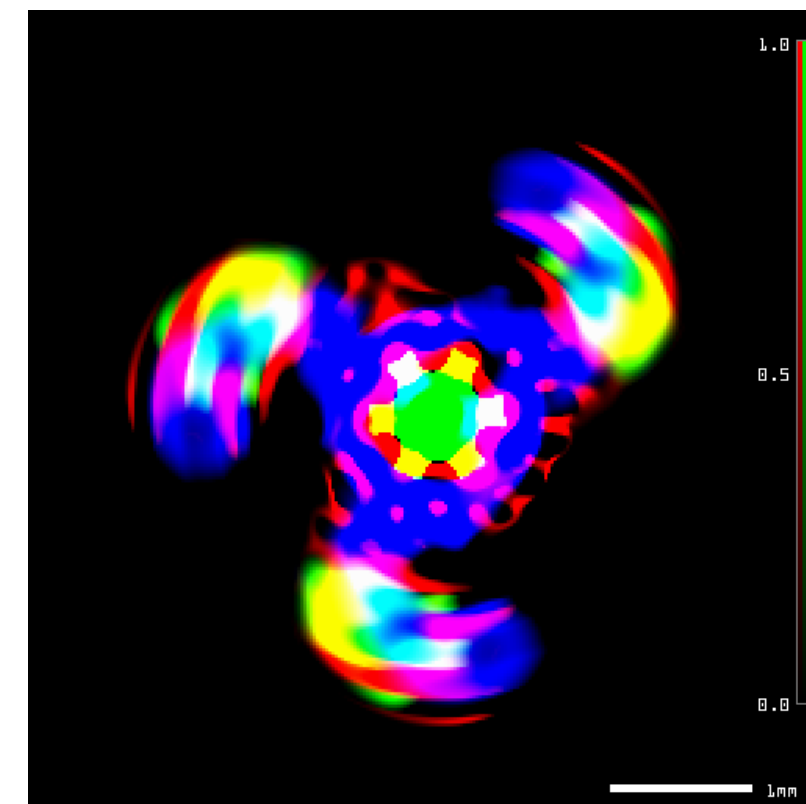
# Emergence in Lenia

- Original Lenia:
  - **Morphogenesis**
  - **Dynamics**
- Multi-channel:
  - **Division of labor**
  - **Polymorphism**
- Multi-kernel:
  - **Individuality**
  - **Self-replication**
- Multi-dimensional:
  - **Polyhedral symmetry**
  - **3D physiology**

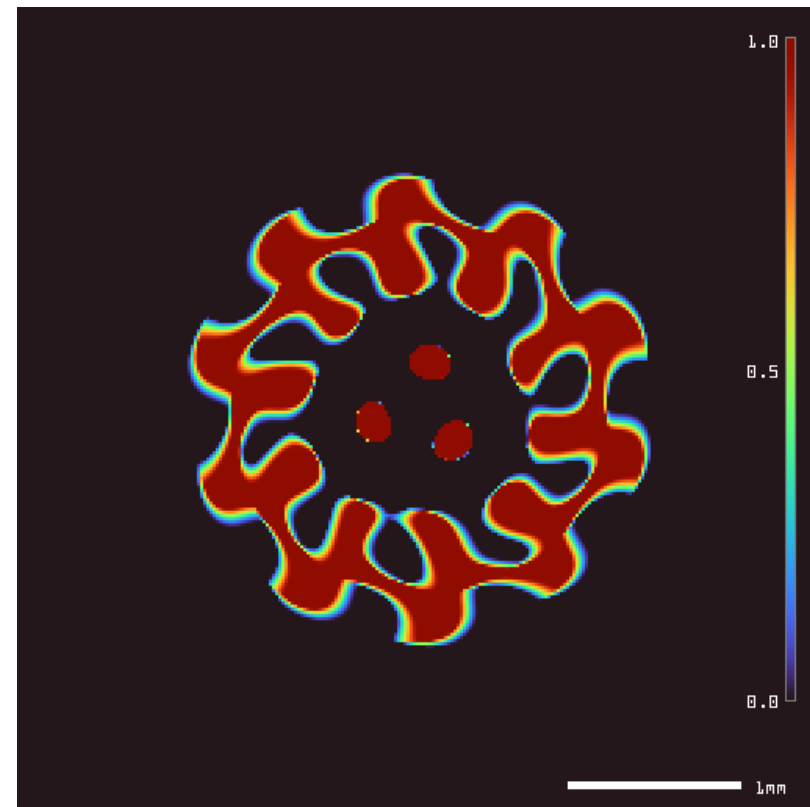
# Emergence in Lenia

# General Features

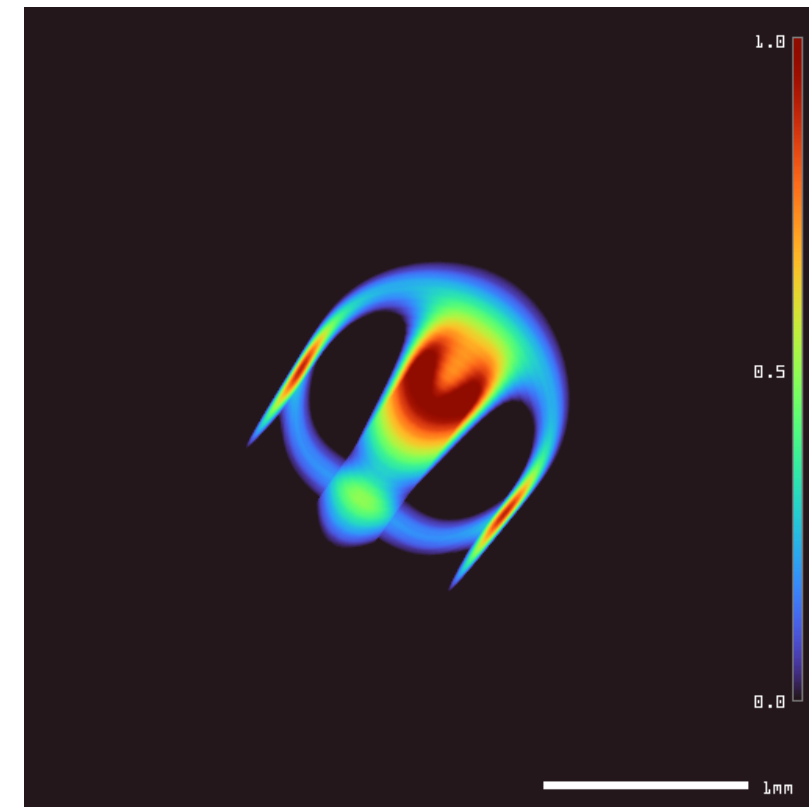
- Can group into **species** & higher orders by similarity
  - Species occupy an area in parameter space
- “**Analog**” structures (vs. “digital” GoL patterns)
- **Plasticity** — resist changes & deformations
- Close relation b/t **symmetry & motility**
- Complex **interactions & reactions**



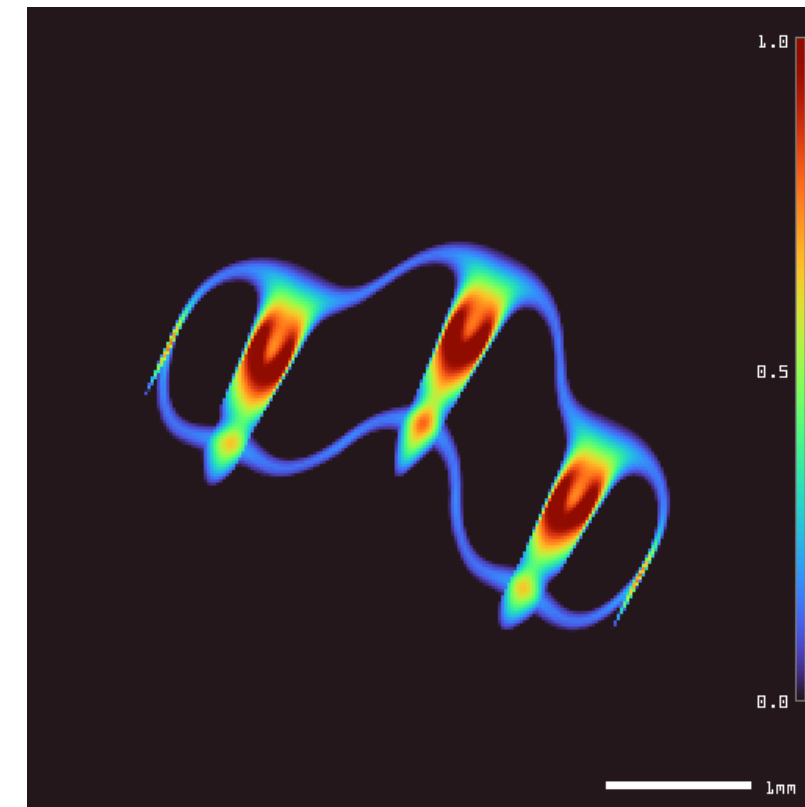
# Morphogenesis



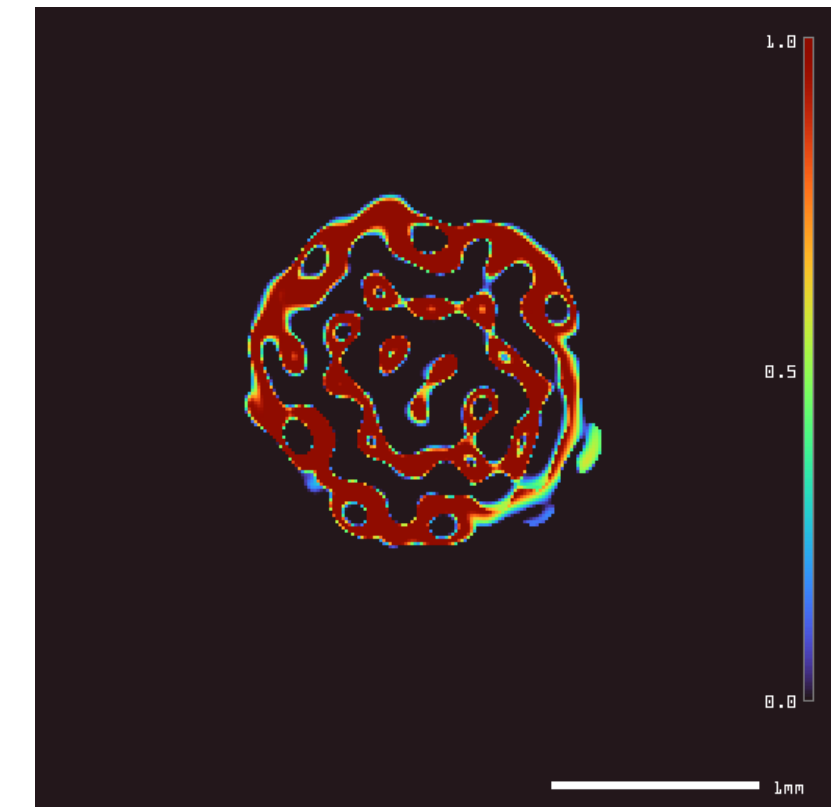
Radial



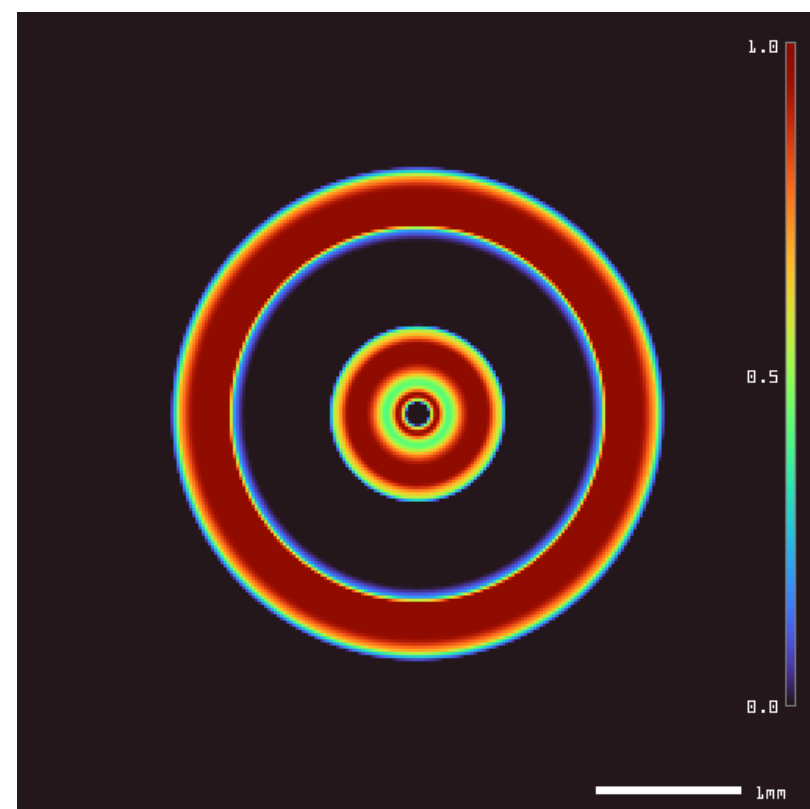
Bilateral



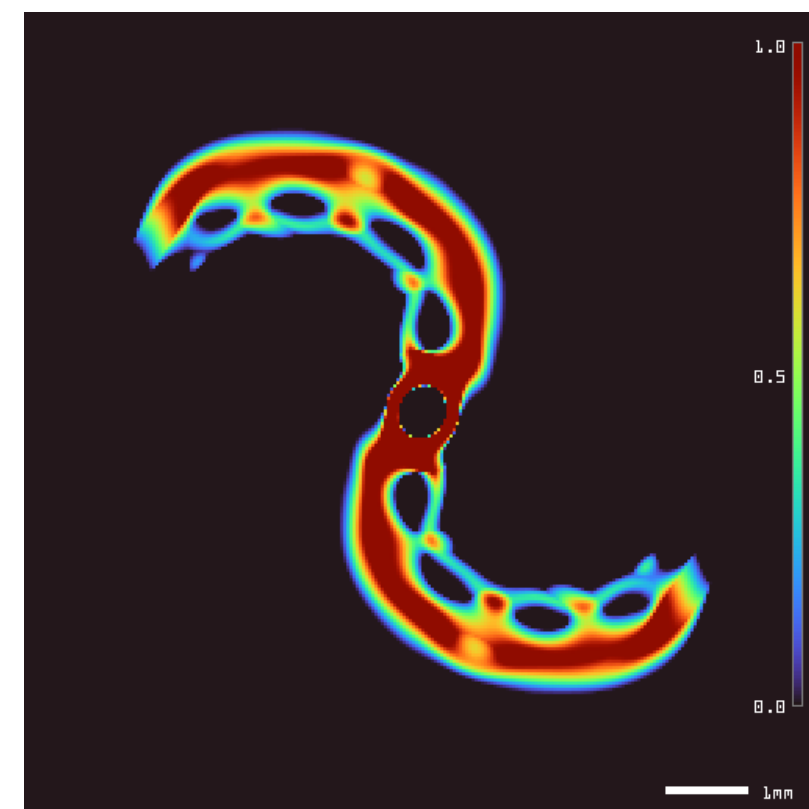
Combinatorial



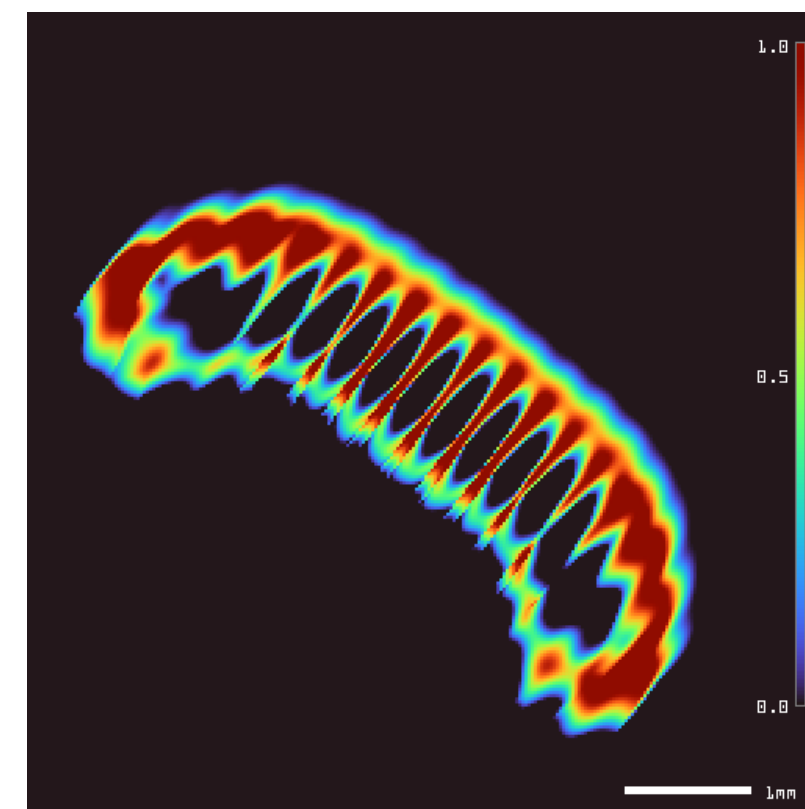
Irregular



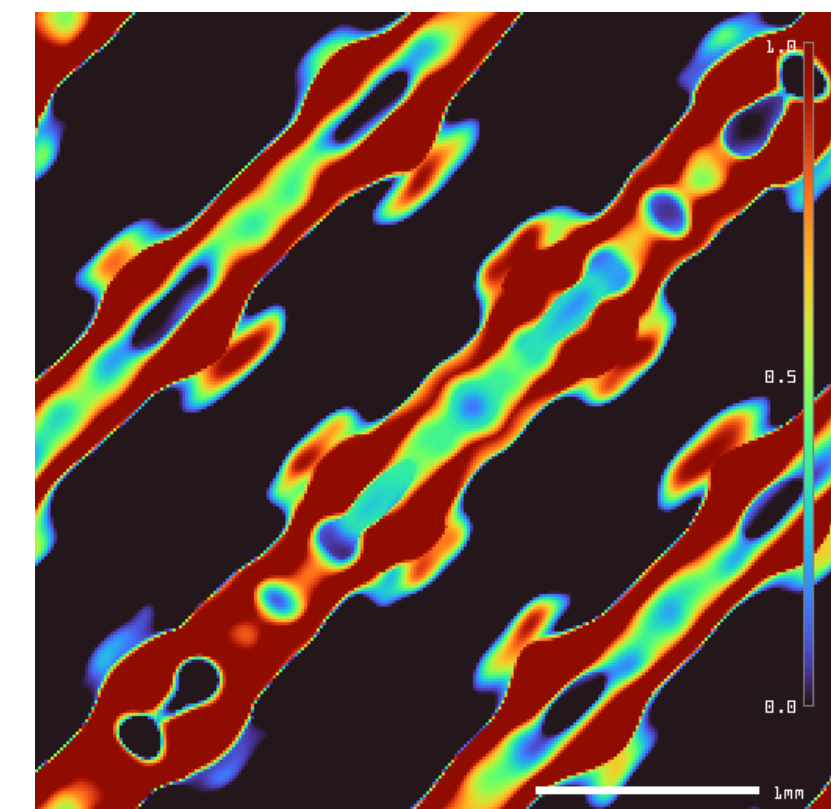
Spherical



Spiral



Linear



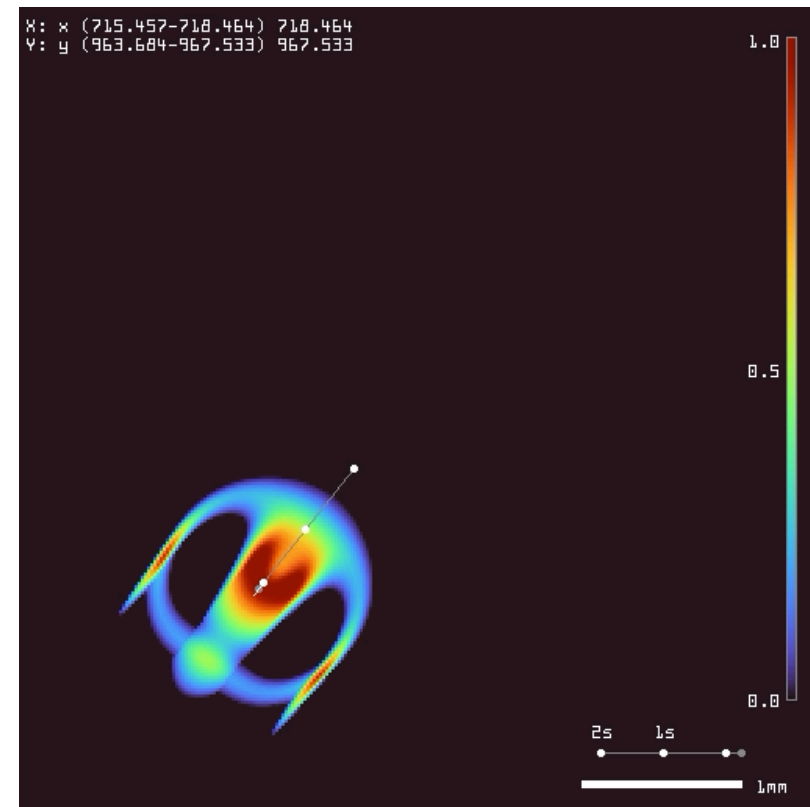
Distributed

Symmetry

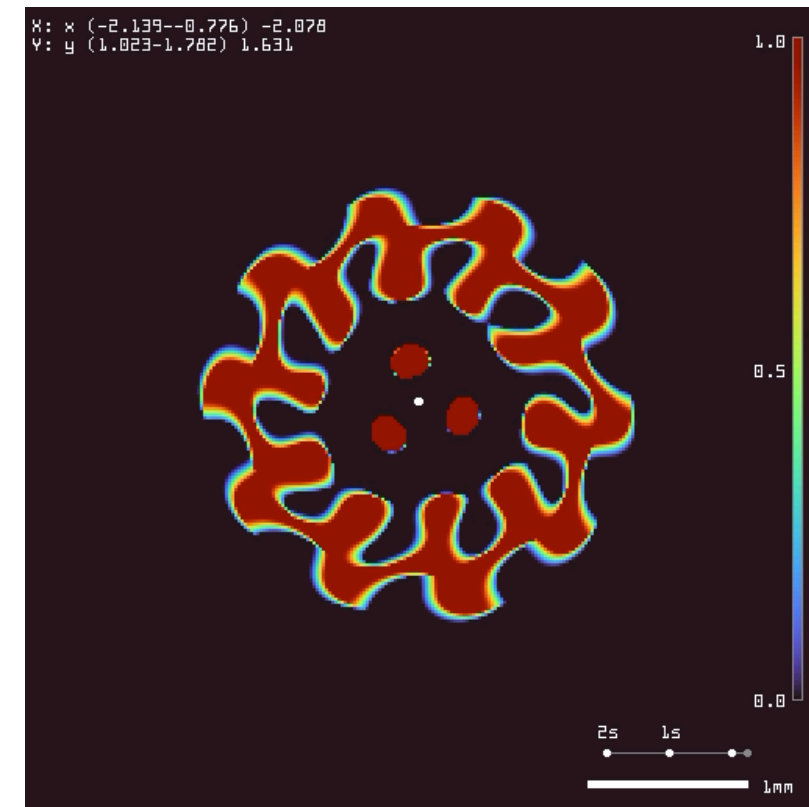
Structure



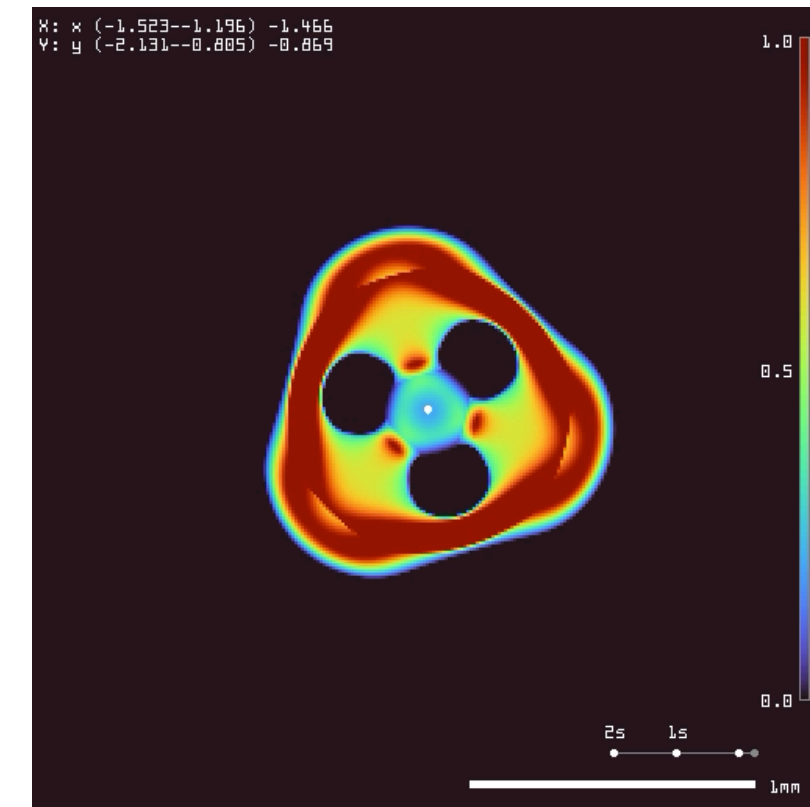
# Dynamics



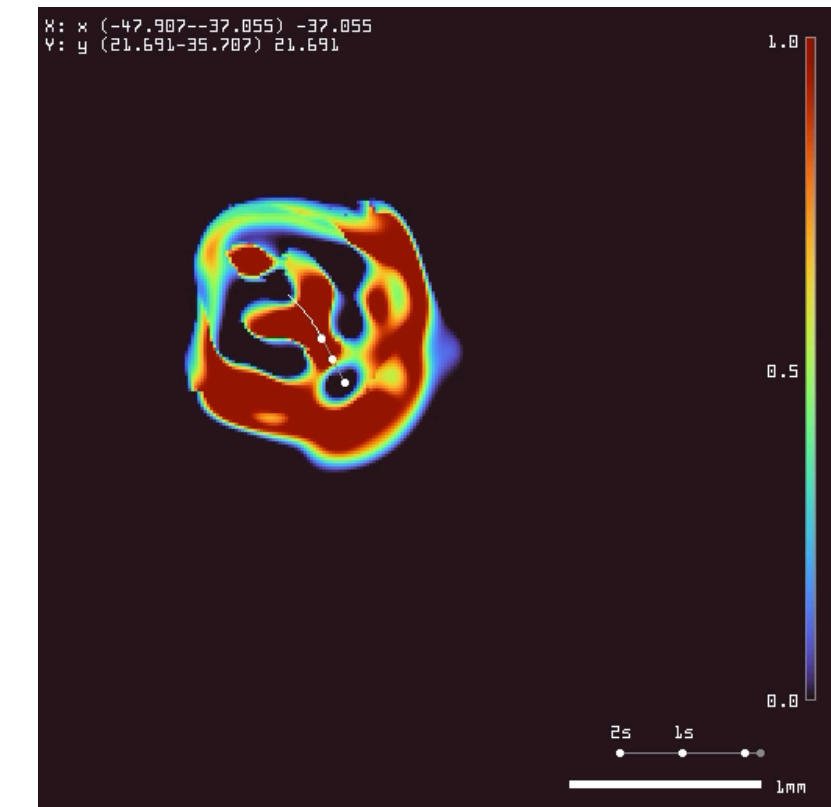
Linear



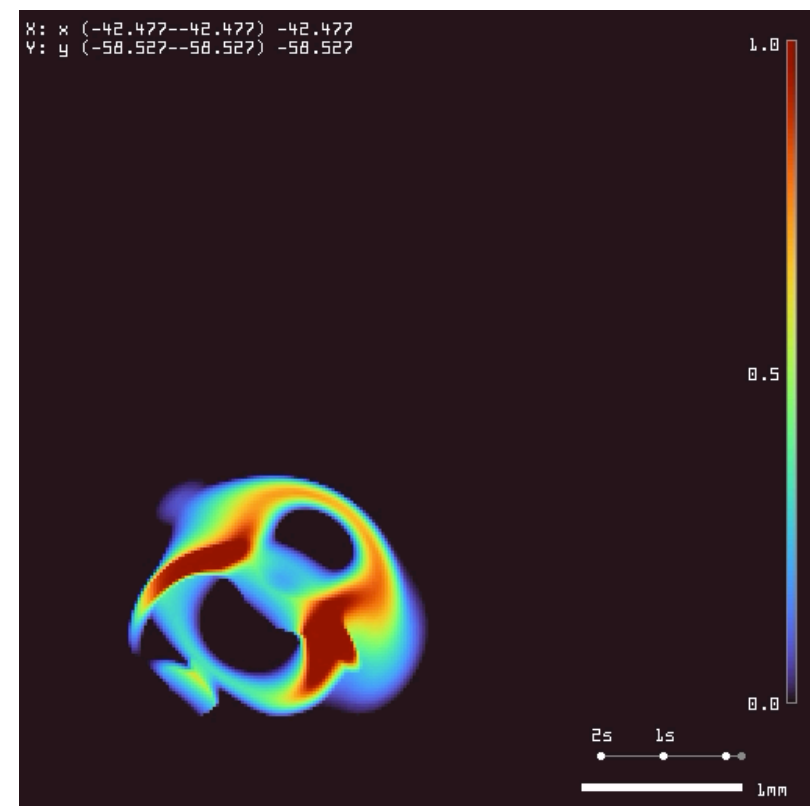
Rotating



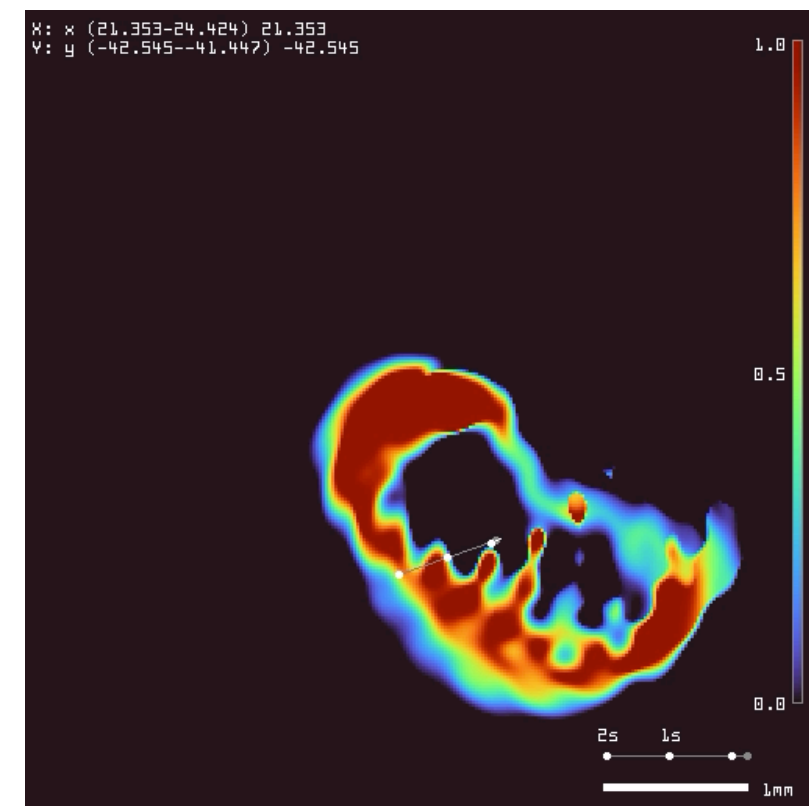
Oscillating



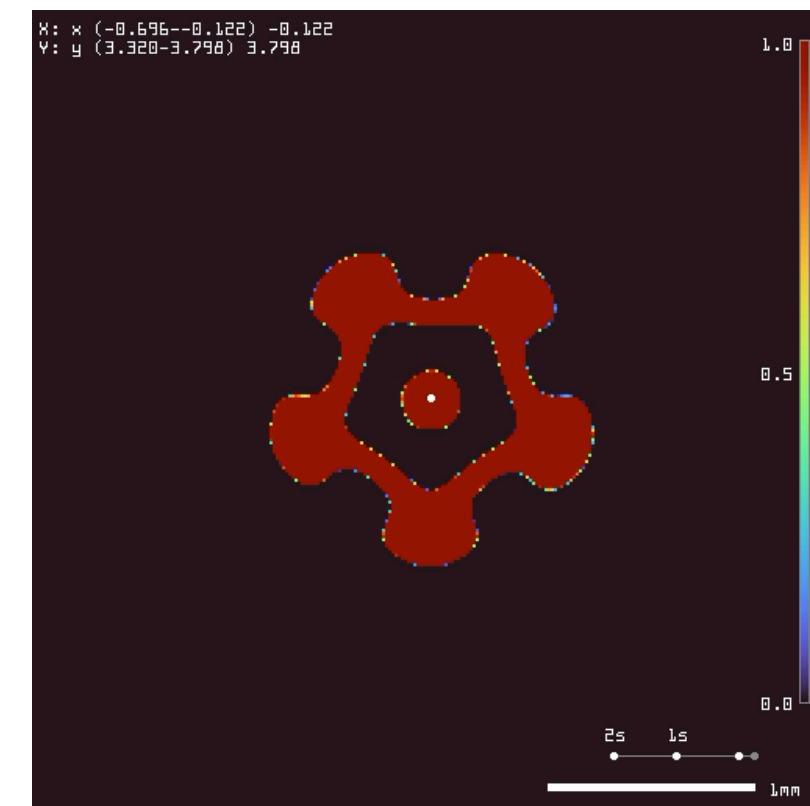
Chaotic



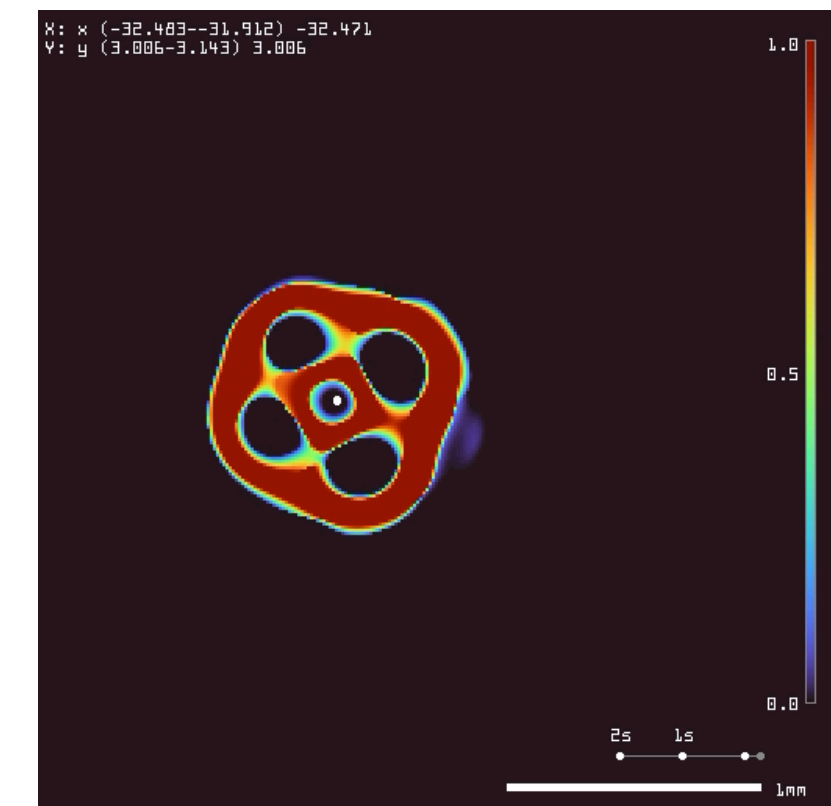
Zig-zag



Gyrating



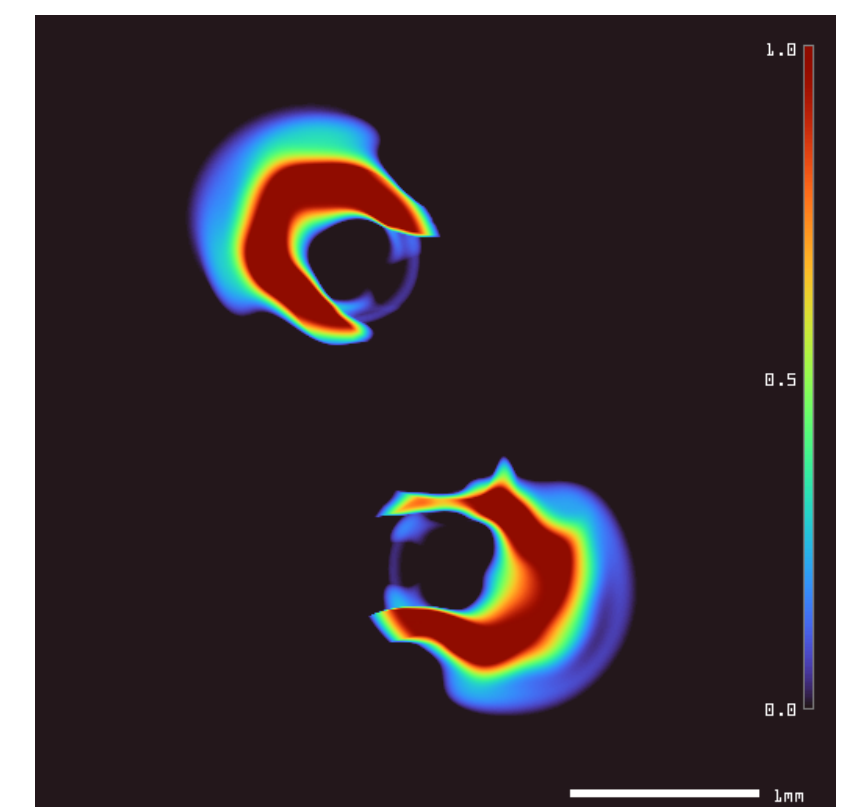
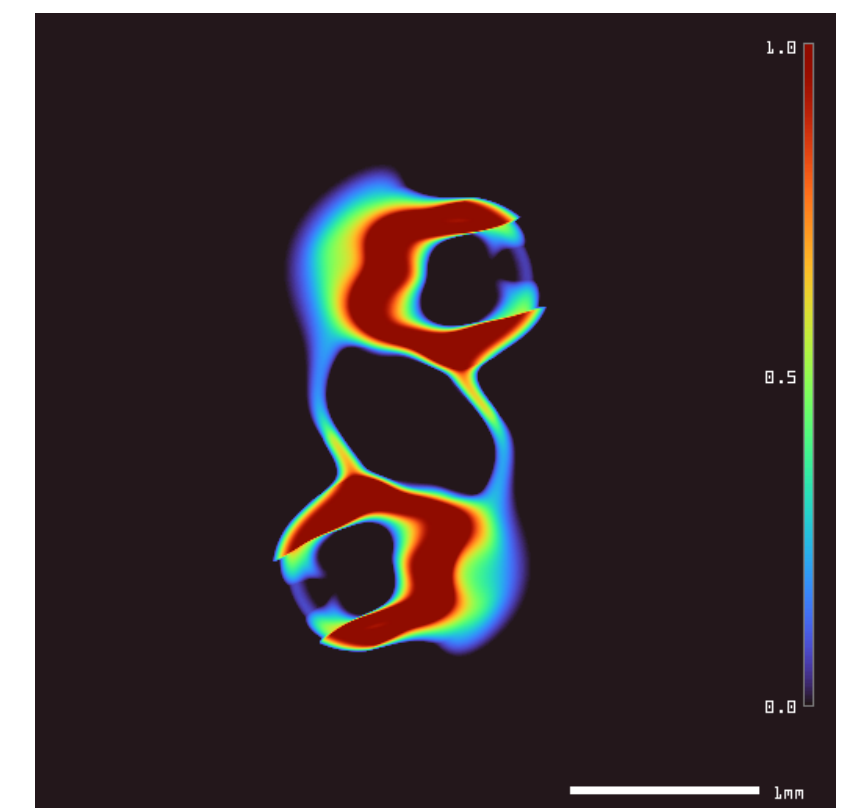
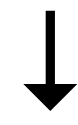
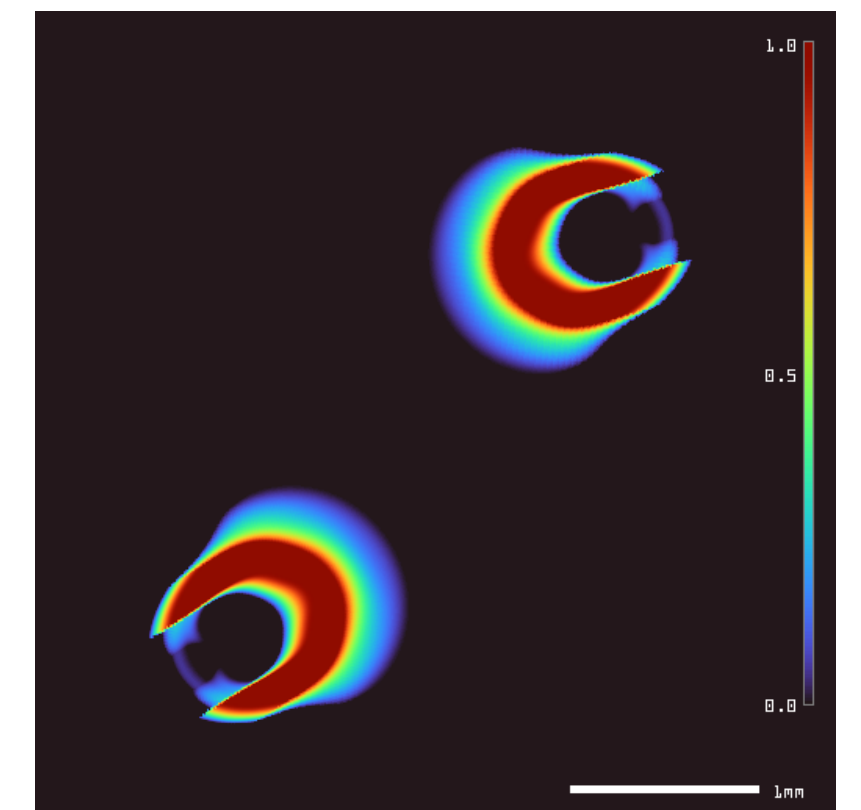
Stationary



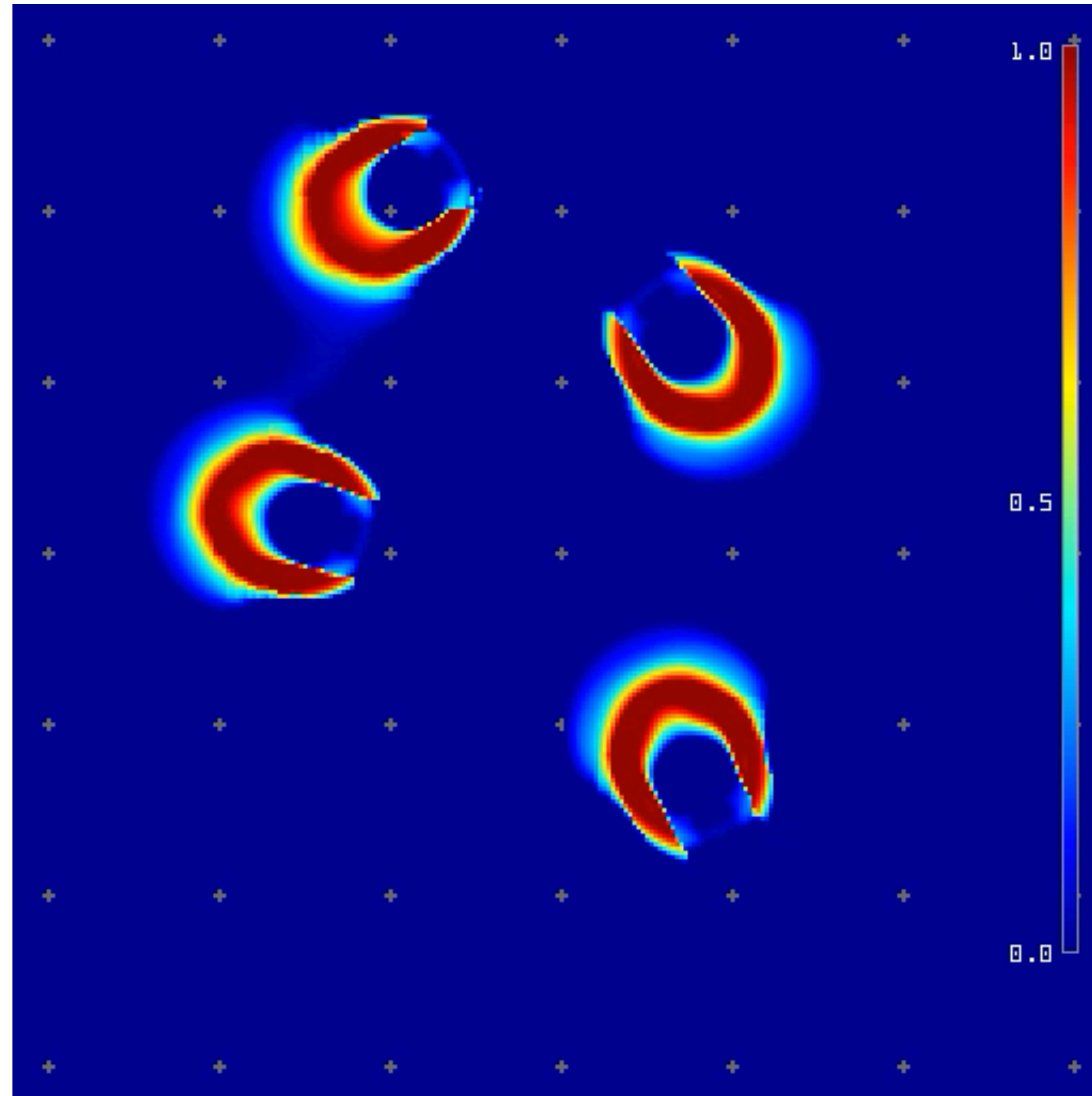
Metamorphosis

# Individuality

- In extended Lenia, many lifeforms able to maintain **own boundaries**
  - Self-containment — stabilize the lifeform
  - Self-defense — separate from environment or each other
- Become an **individual** or **agent**
  - Interact through attractive & repulsive “forces”
  - Enable **complex interactions**

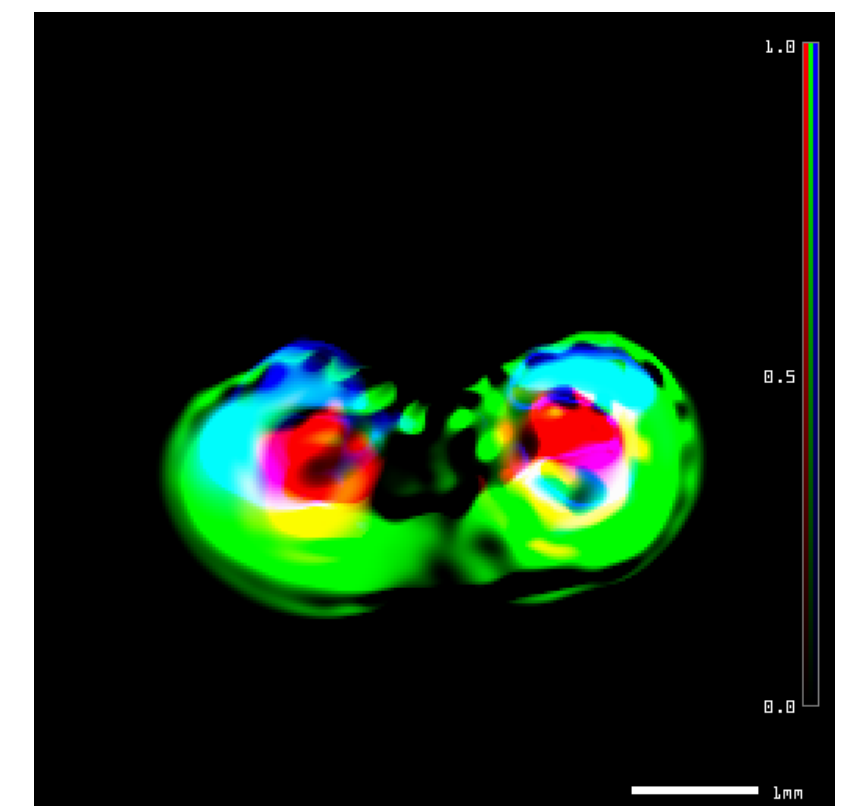
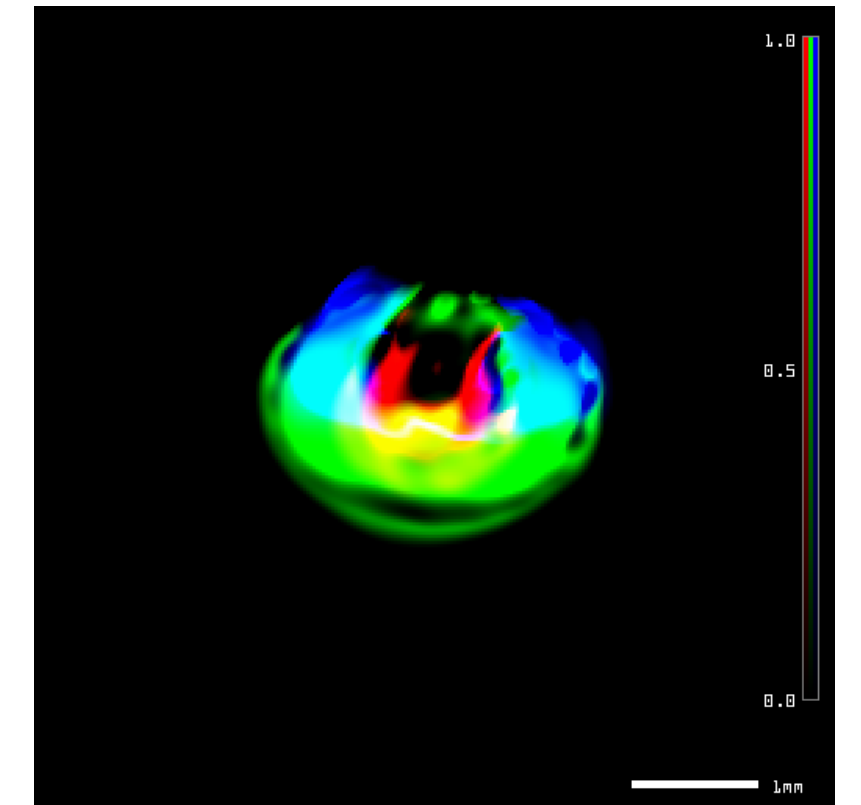


# Individuality

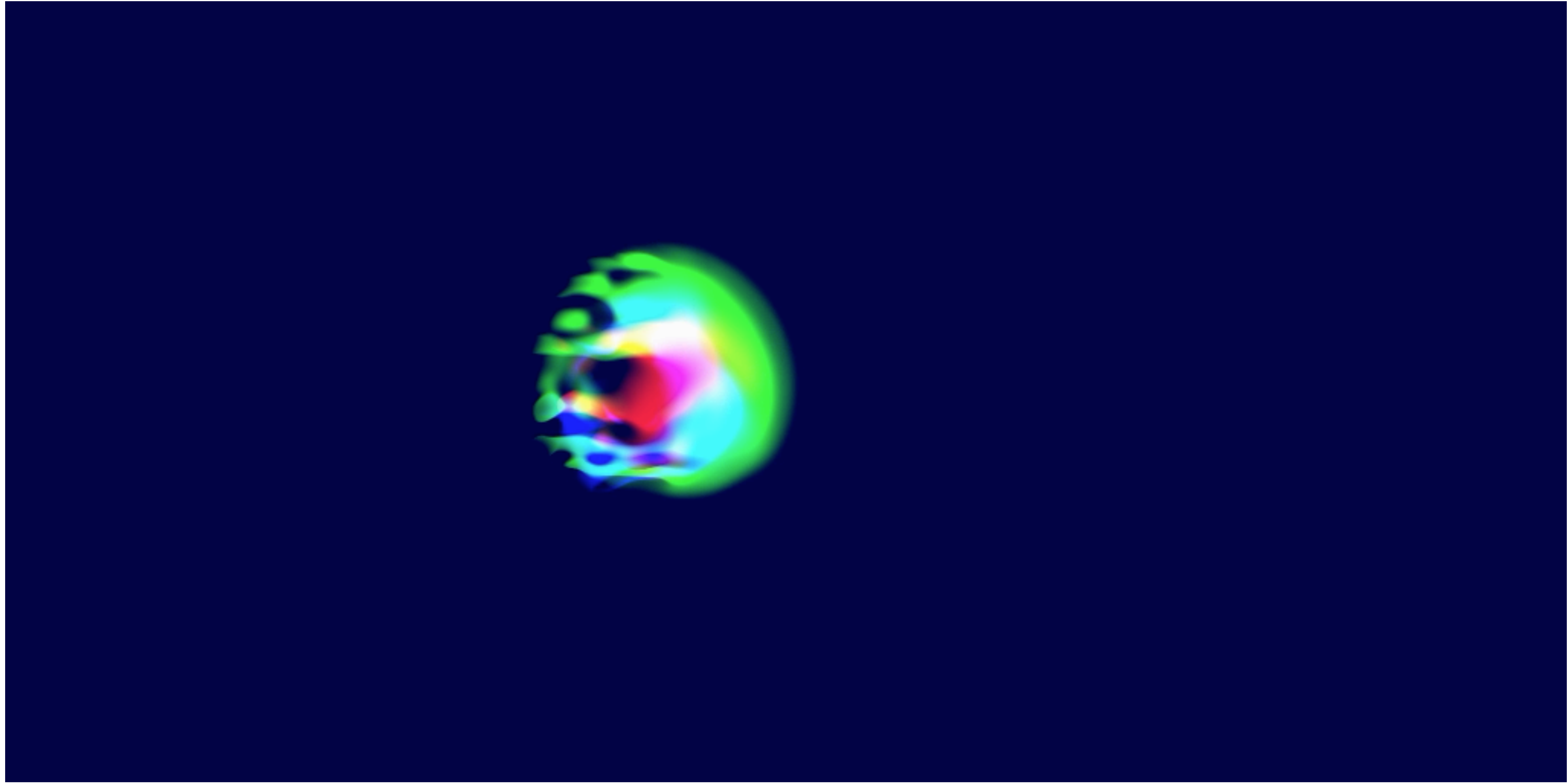


# Self-Replication

- Some lifeforms able to **reproduce**
  - usually by **binary fission**
  - **autocatalysis** (i.e. more reproductive when crowded)
- Self-replication + occasional death = healthy community

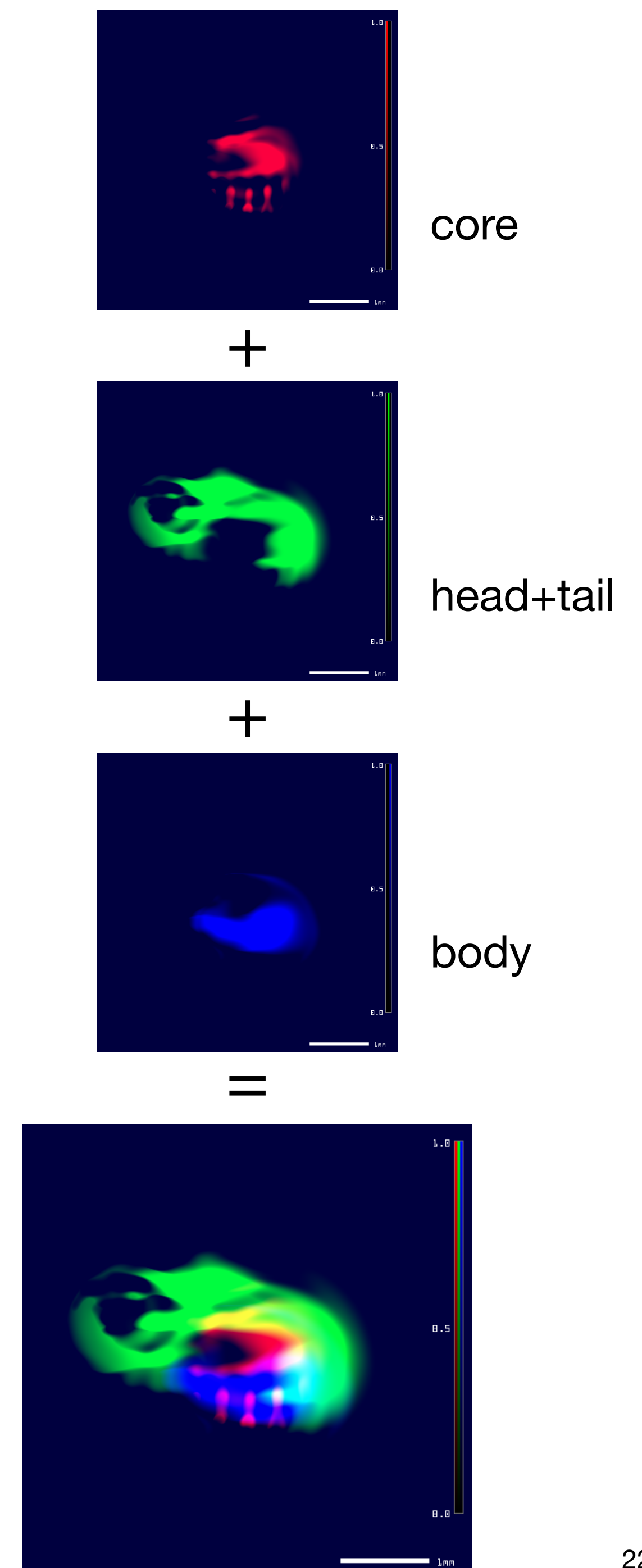


# Self-Replication



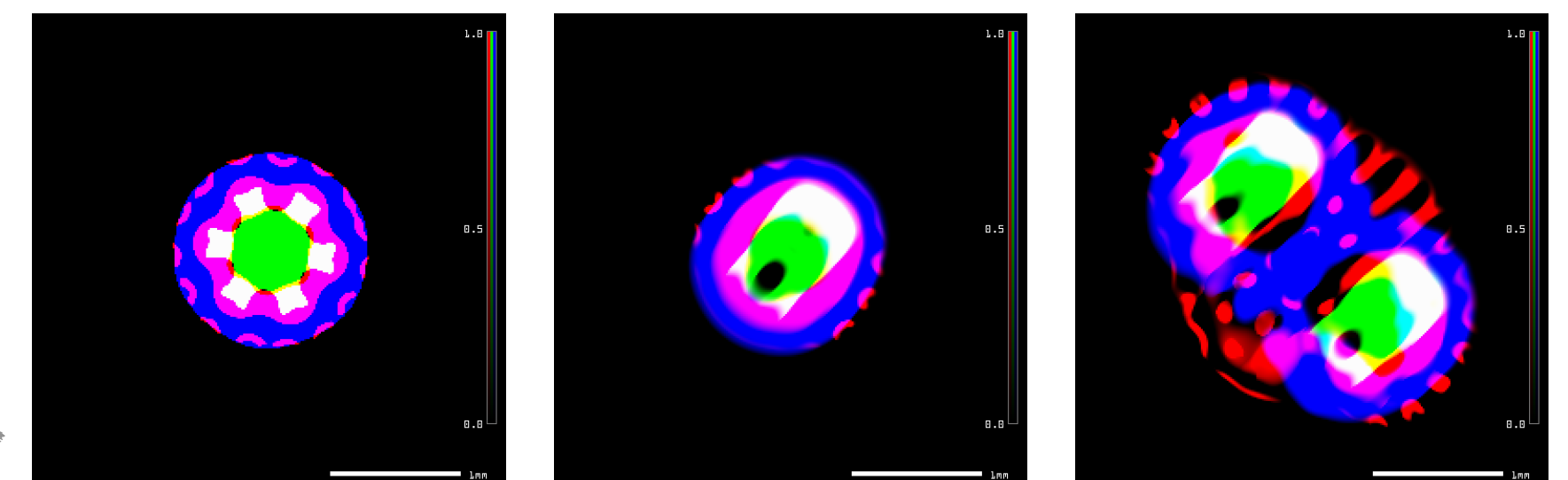
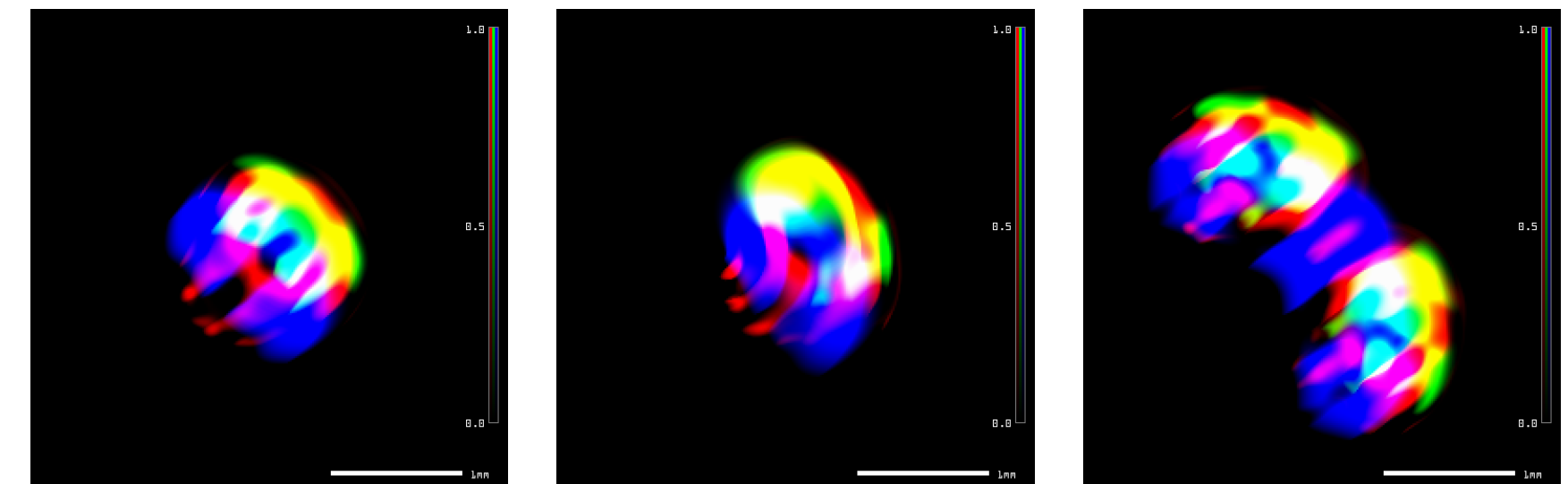
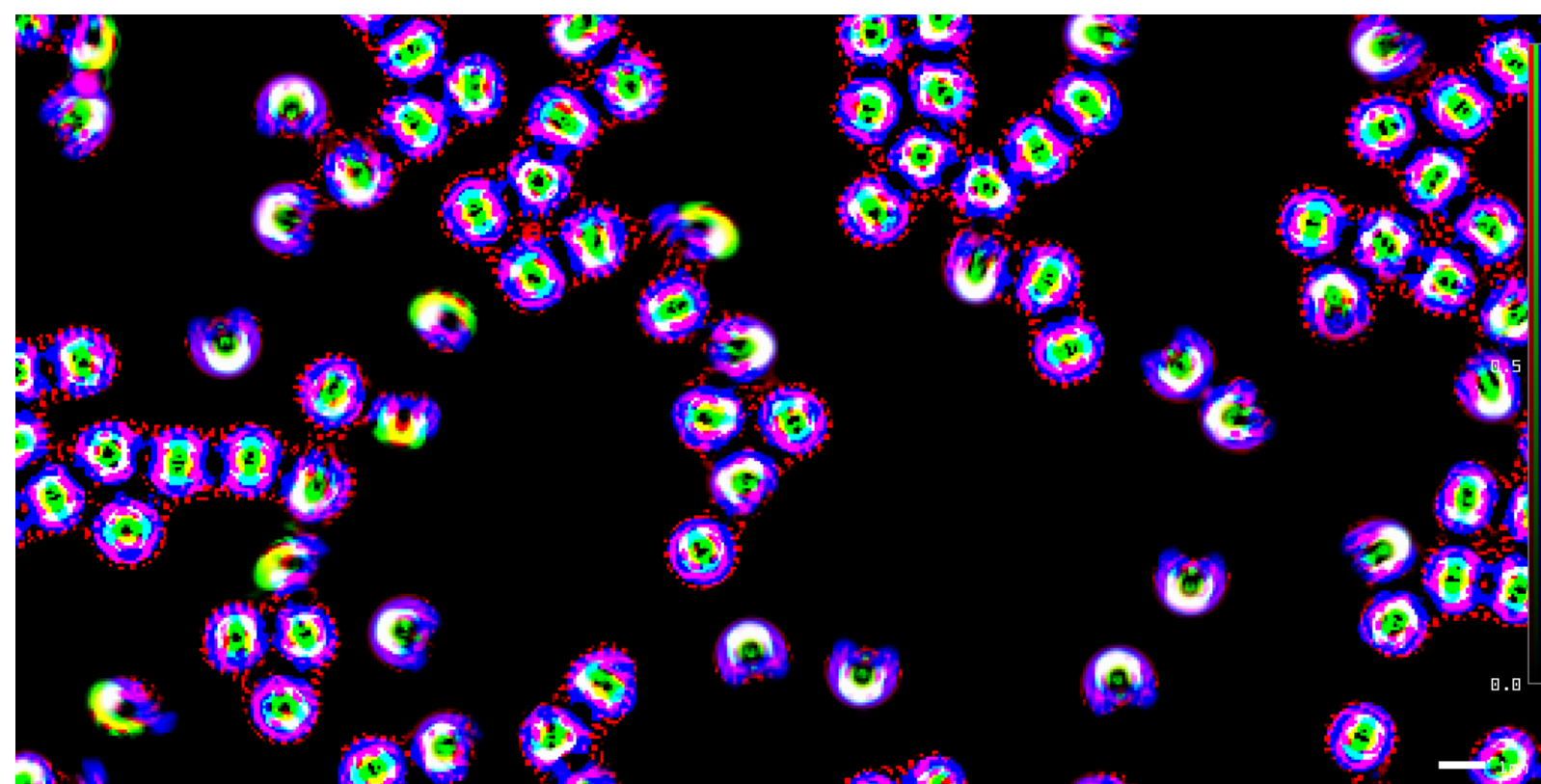
# Division of Labor

- Parts coordinate to form an **aggregated, coherent** lifeform
- Parts occupy specific regions, may have **special roles**
  - Core (“nucleus”) — anchor for other parts
  - Body (“cytoplasm”) — extent of the lifeform
  - Director (“pseudopod”) — guide movements
  - Trailing part (“tail”)
  - Particles (“messenger”?)

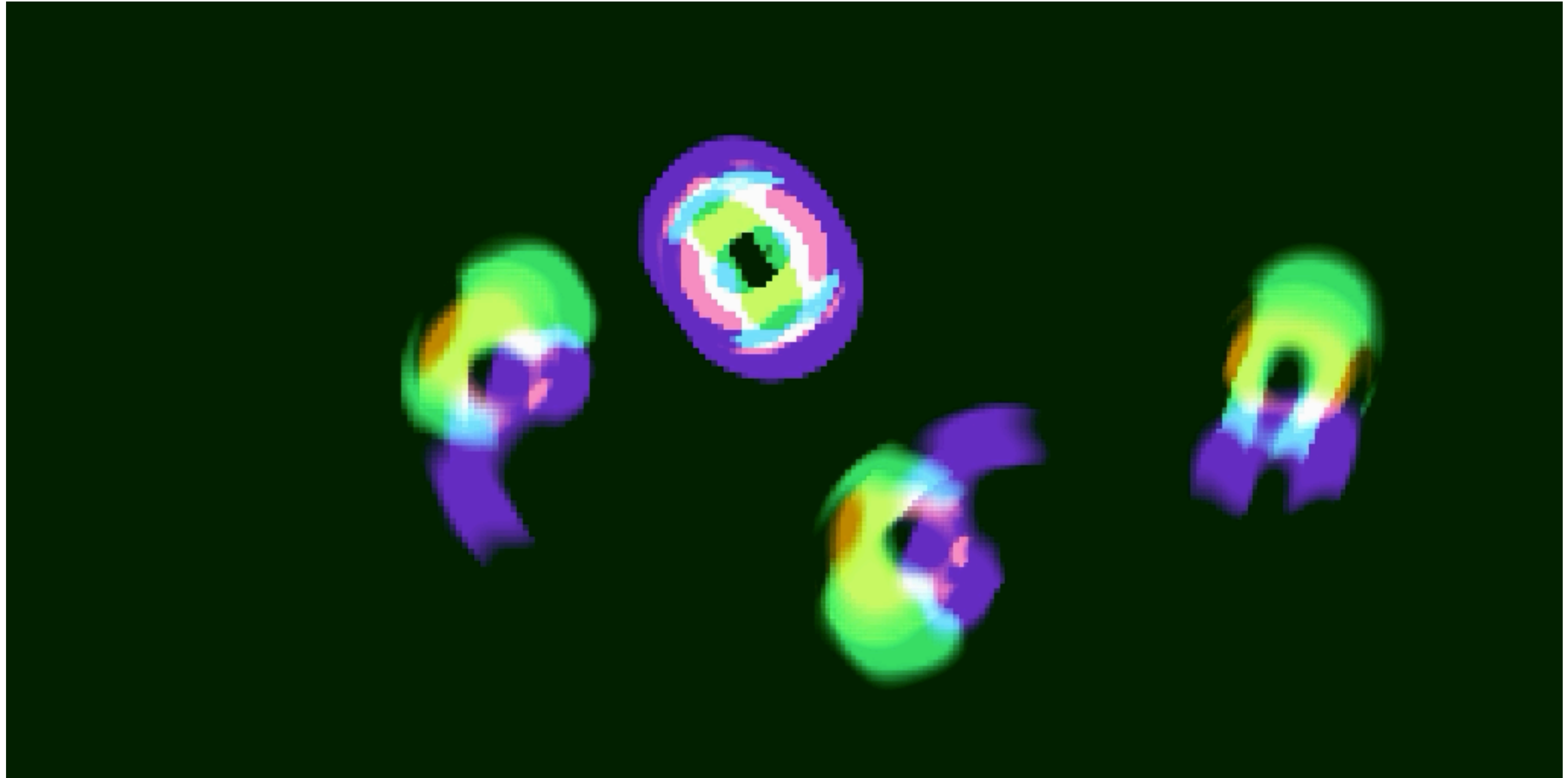


# Polymorphism

- **Same genotype** (i.e. rule parameters) may produce **multiple phenotypes**
  - **Switch phenotype** — rearranging parts to reach stable configuration
  - **Group level behaviors**
    - reproducing phenotype = colony of growing population
    - immobile phenotype = tissue-like colony



# Polymorphism

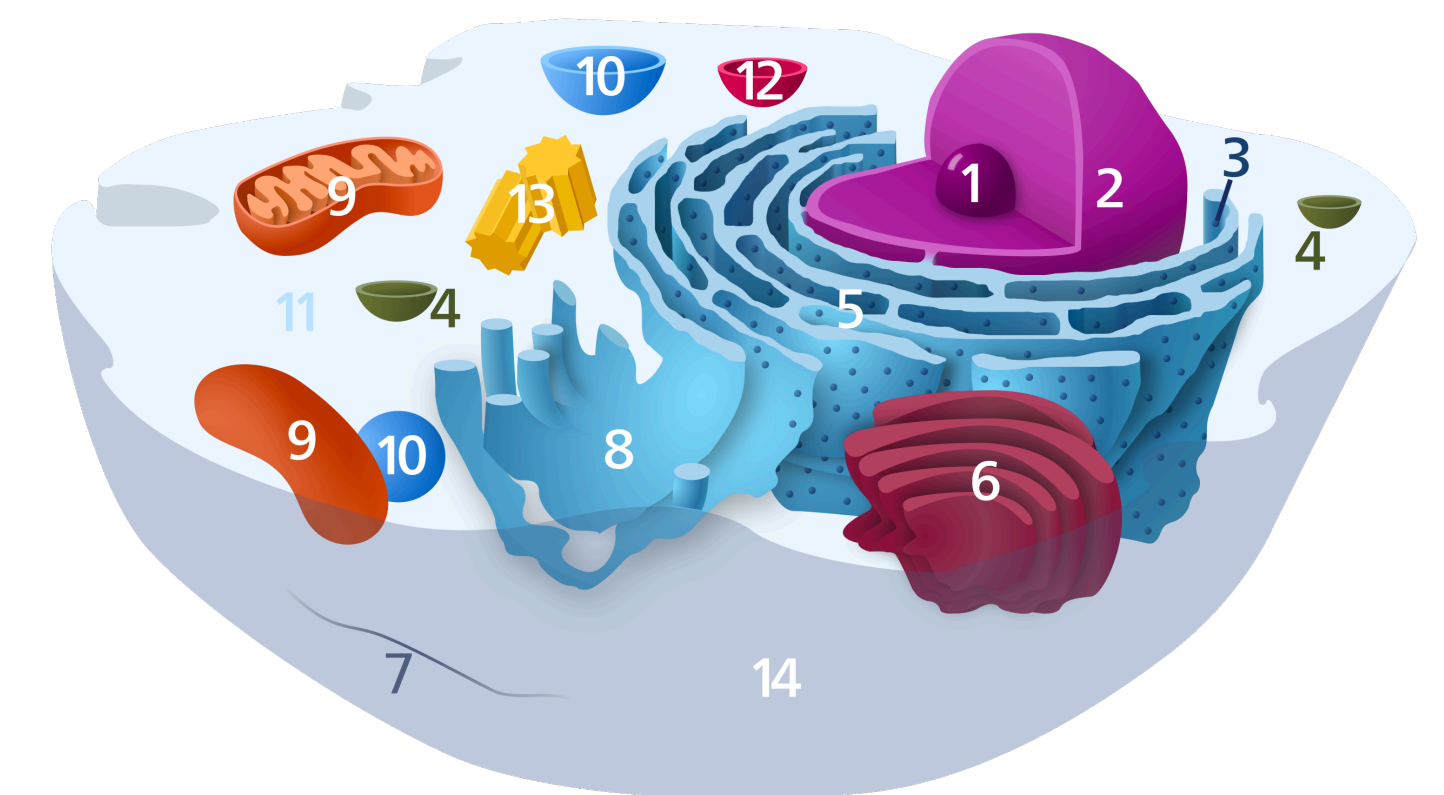
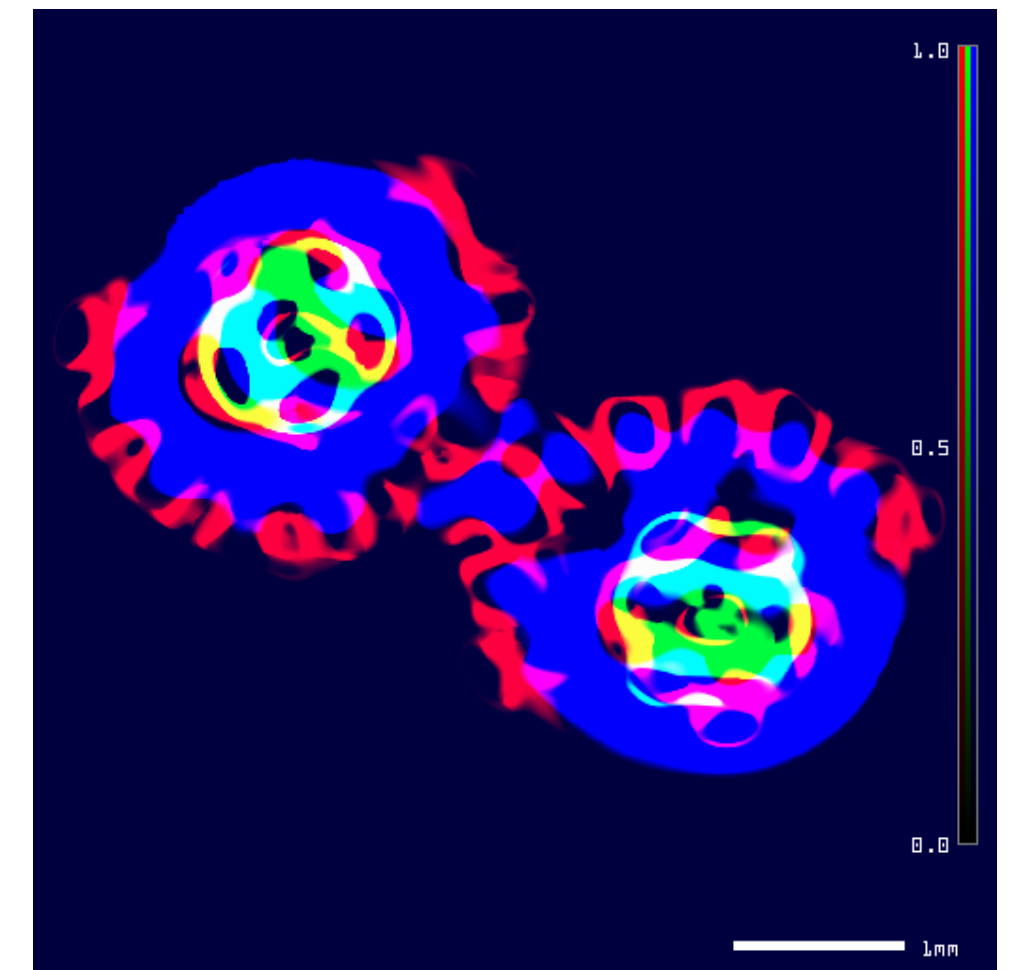




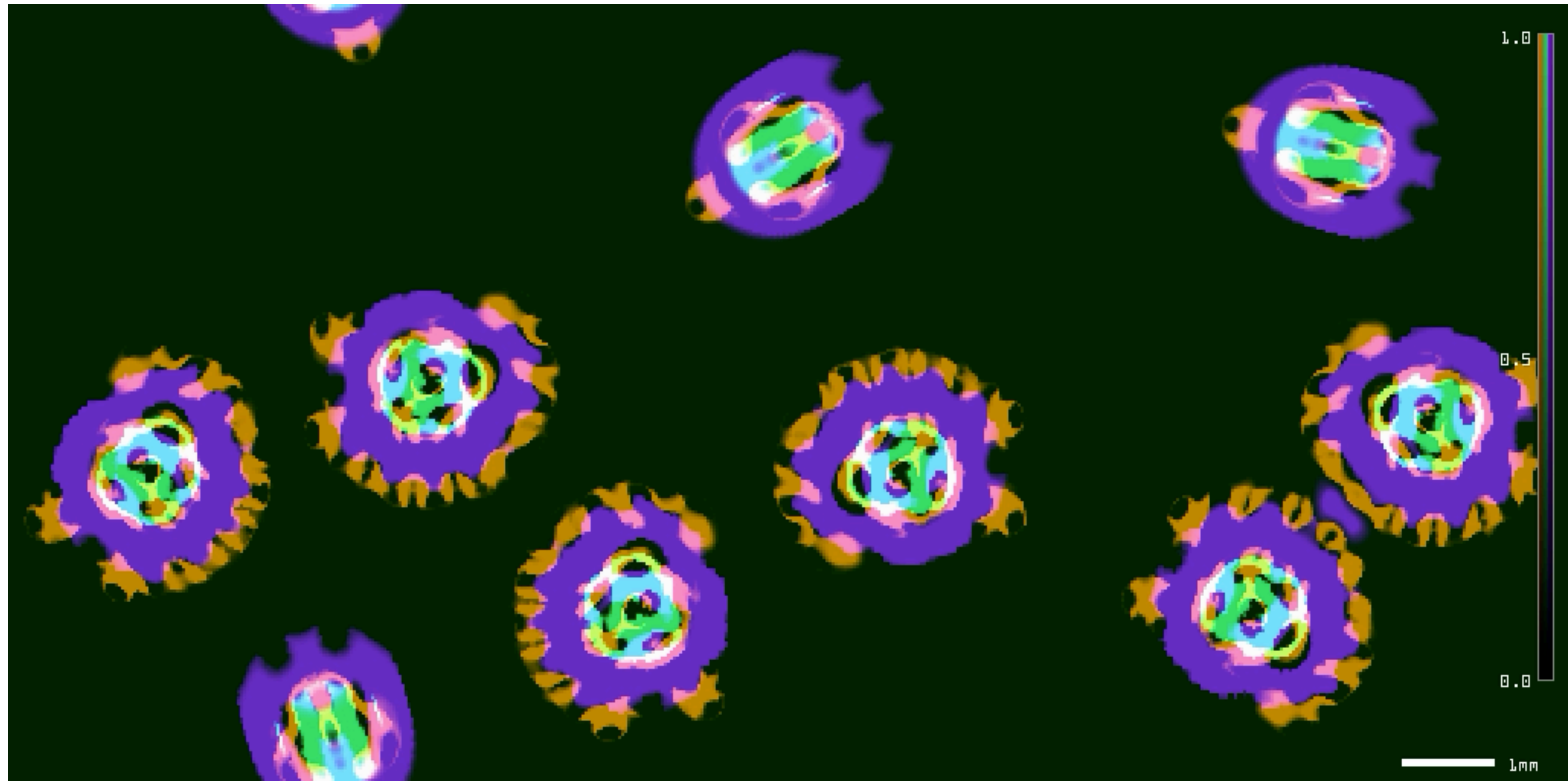
# “Virtual Eukaryotic Cells”

= advanced virtual lifeforms with emergent properties:

1. Individuality with self boundary (“**cell membrane**”)
2. Internal division of labor (“**organelles**”)
3. Phenotypic polymorphism (“**cell differentiation**”)
  - various attributes: moving, stable, reproducing, etc.
4. Megastructure formation (“**multicellularity**”)
5. Cell-cell communication (??)

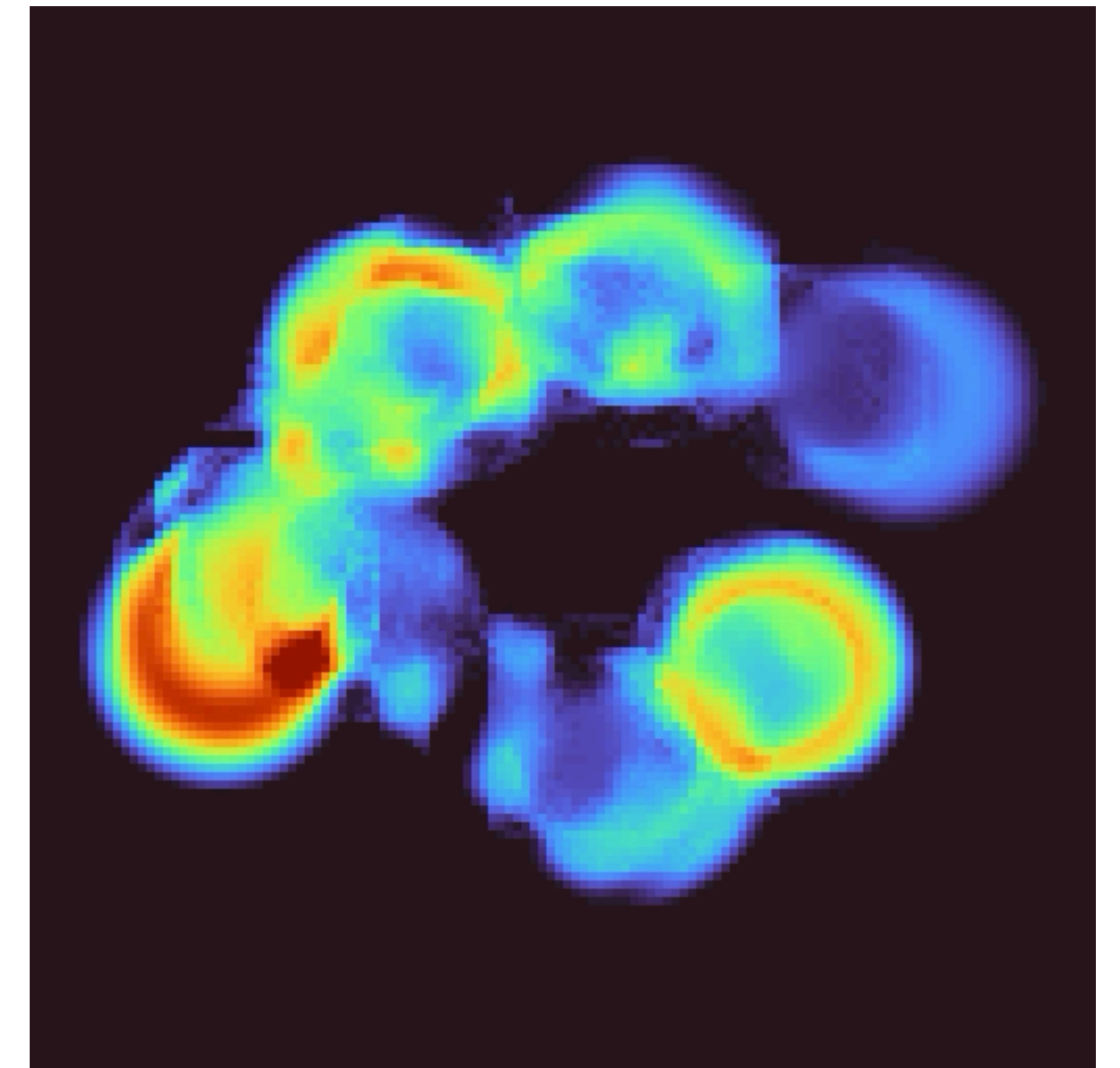
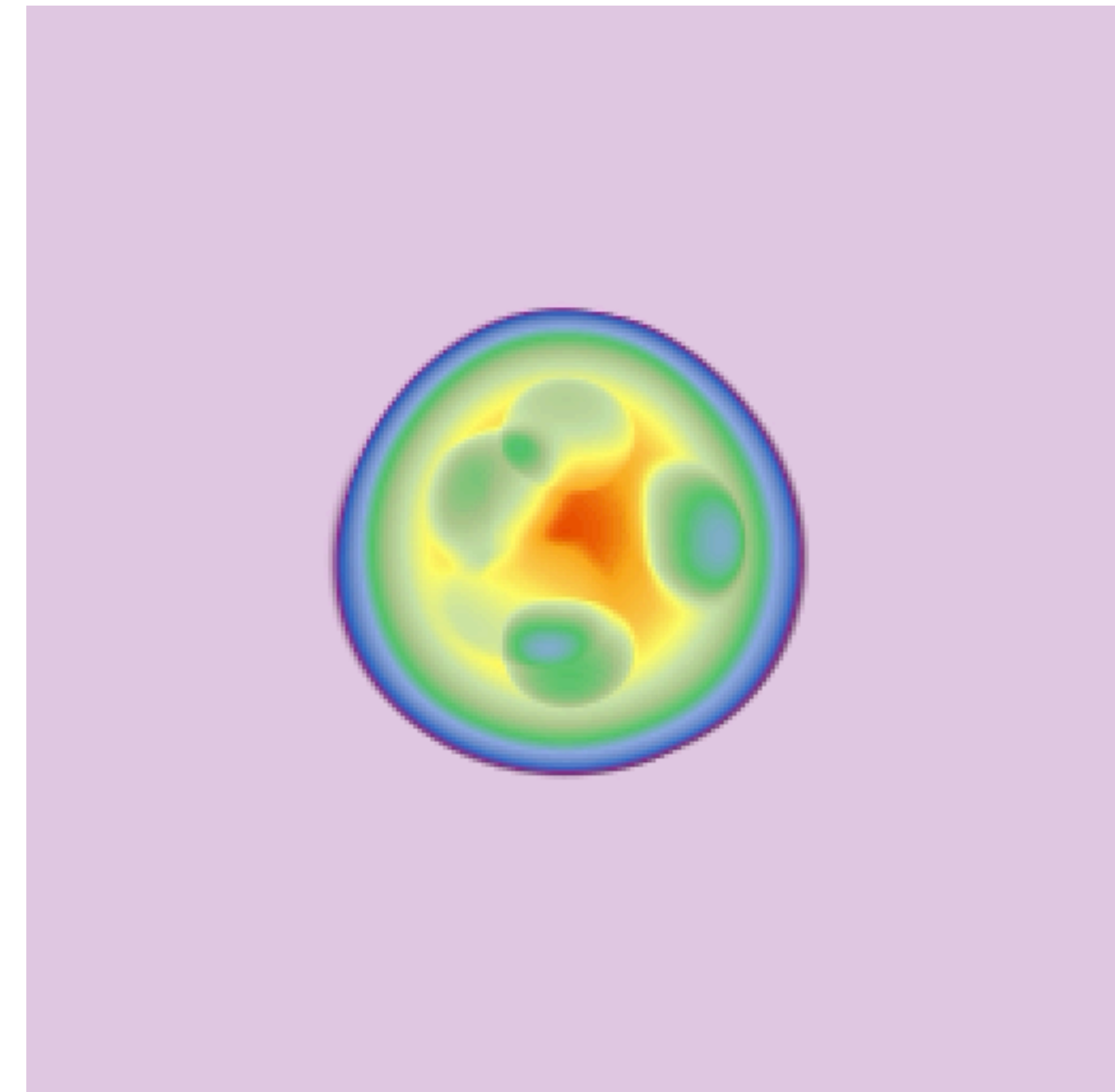


# “Virtual Eukaryotic Cells”



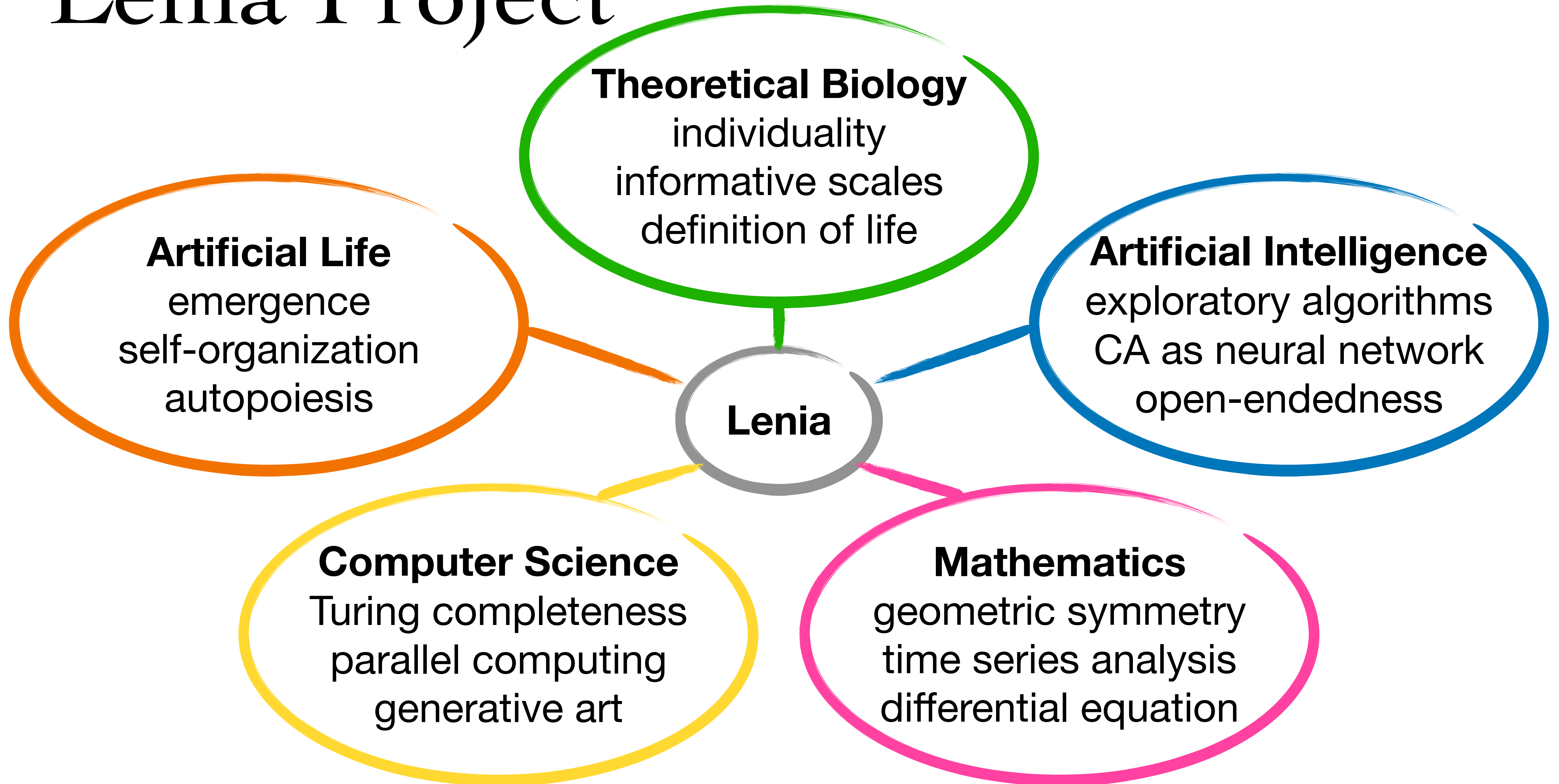
# 3D Structures

- 3D: Spherical and **polyhedral symmetries**
  - Analogous to radial symmetries in 2D
  - Internal structures arranged in tetrahedron / bipyramid / icosahedron etc.
- 3D creatures with **interesting physiology**
  - e.g. Snake 3D™ grows by ingesting dots
- 4D: simple **hyperspheres** so far

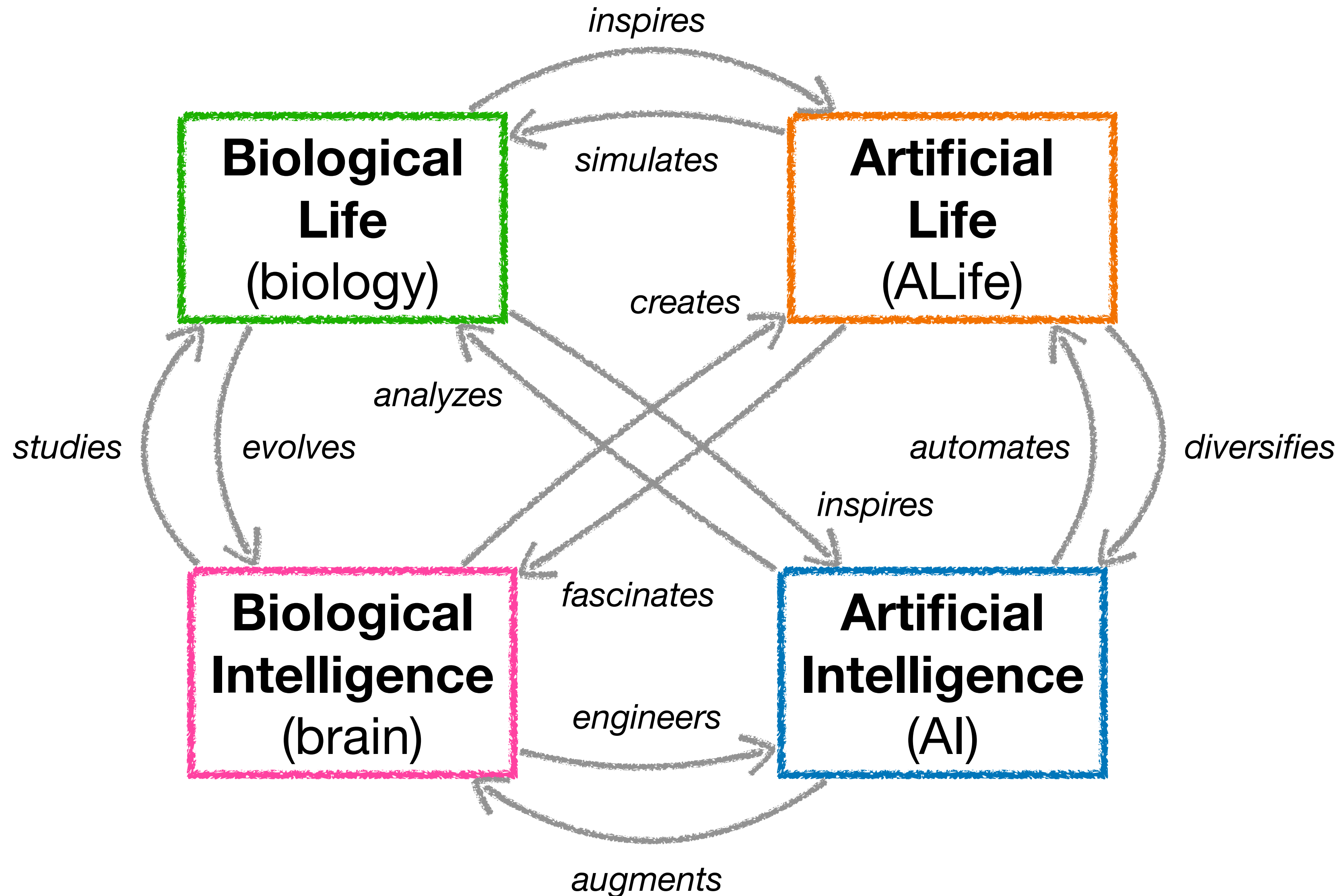


# ALife and AI

# Lenia Project



# Connections of Life & Intelligence

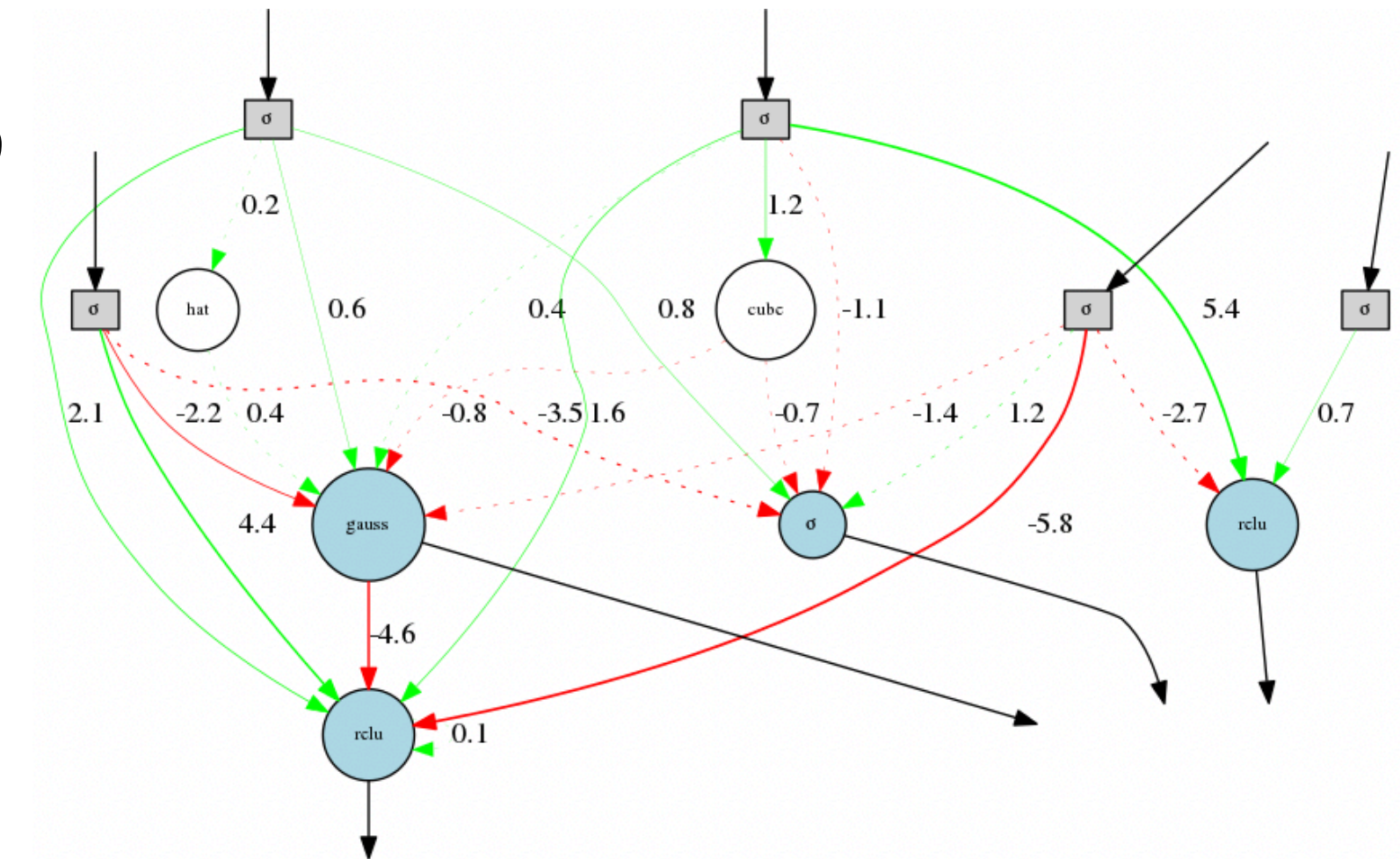


# ALife & AI

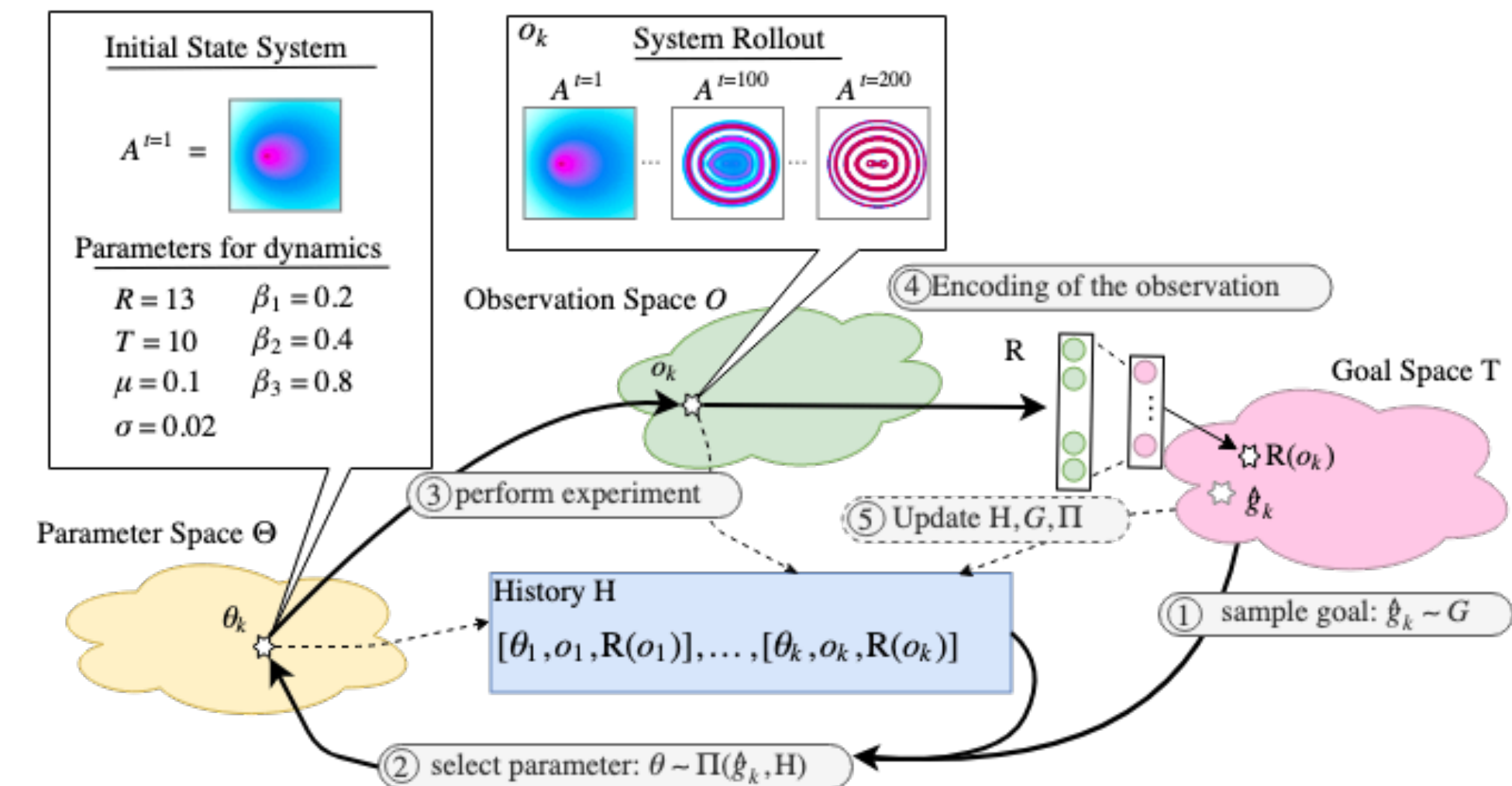
- **Apply AI on ALife:**
  - Lenia as a playground for AI methods
  - Exploratory algorithms & genetic algorithms
  - Pattern recognition, encoding, generation (e.g. VAE, CPPN, GAN, Neural ODE)
- **From ALife to AI:**
  - Lenia's architecture as a neural network
  - Open-ended evolution

# Exploratory Algorithms

- **Genetic algorithm** to discover new lifeforms  
e.g. [T Arita @NagoyaU]
  - minimum criterion: survival
- **Curiosity-driven** algorithms  
e.g. IMGEP [PY Oudeyer @Inria]
- **Novelty search** algorithms  
e.g. quality diversity [KO Stanley @OpenAI]
- **Neuroevolution** to evolve architecture  
e.g. CA-NEAT [S Nichele]



result network in CA-NEAT

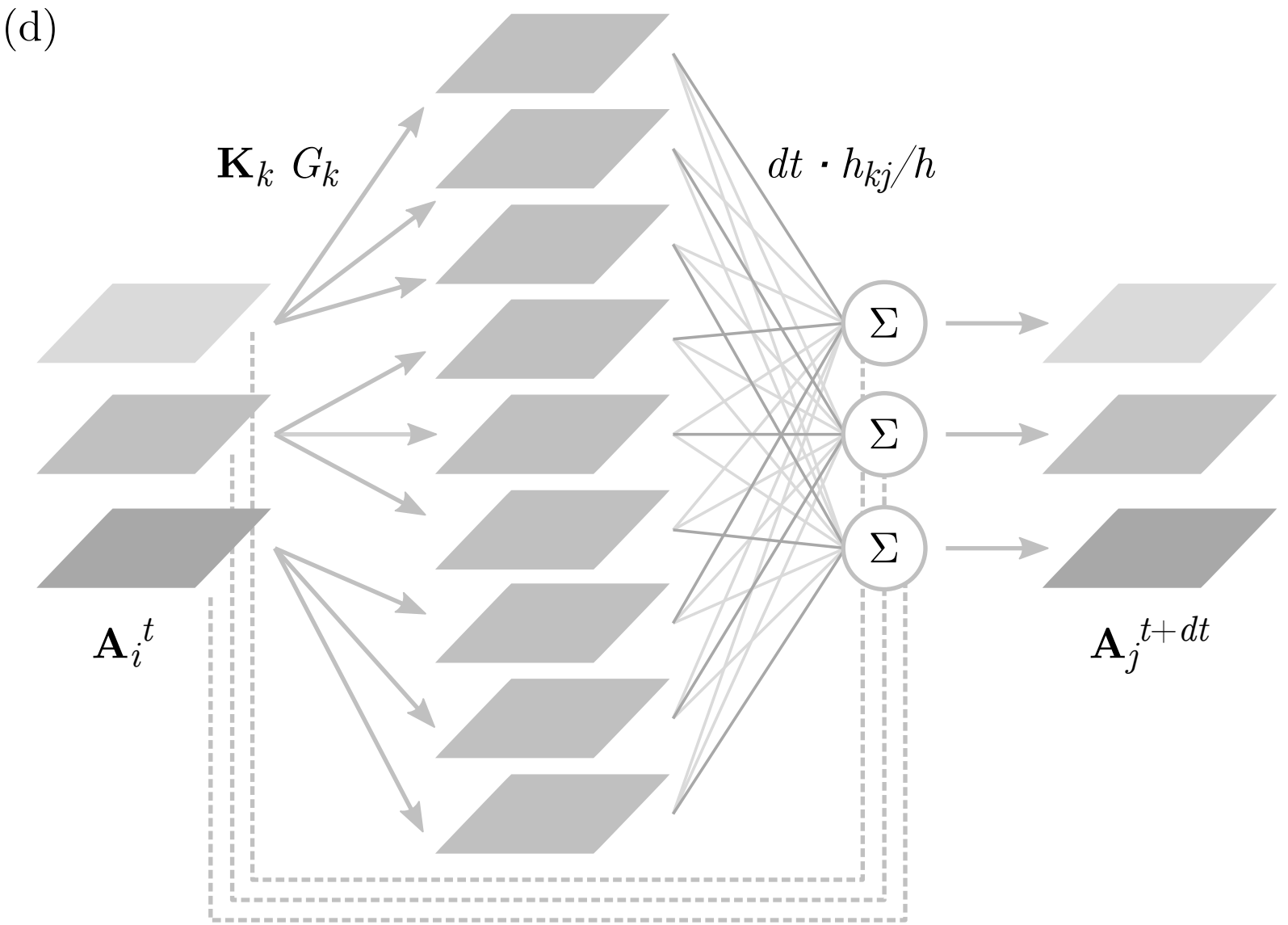


IMGEP algorithm

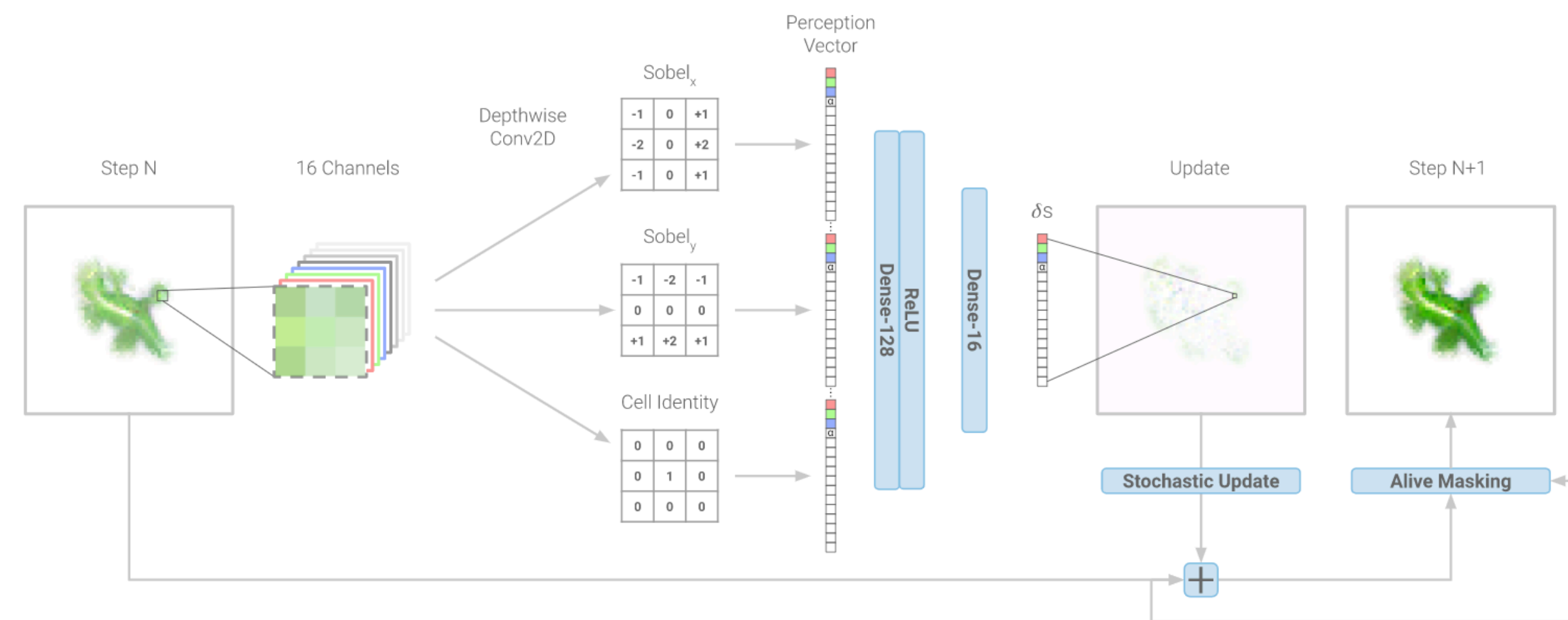


# CA as Neural Network <sup>(d)</sup>

- Latest architecture approaches “Recurrent Residual Convolutional Neural Network” (RRCNN)
  - is **evolvable** (neuroevolution)
  - perhaps **trainable** (back-prop)
  - what would be the loss function?
- cf. **Neural CA**: back-prop through CA [A Mordvintsev @Google]



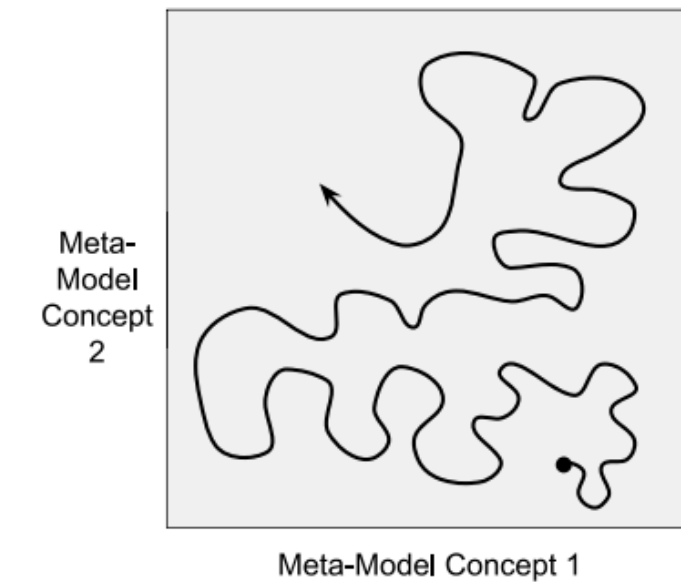
extended Lenia architecture



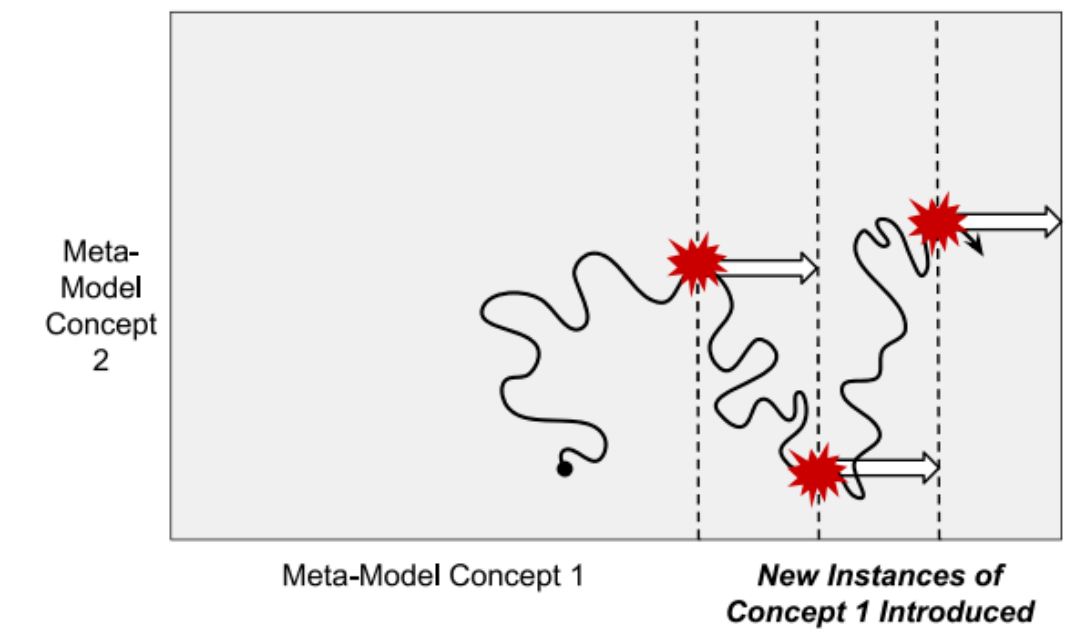
Neural CA architecture

# Open-Ended Evolution

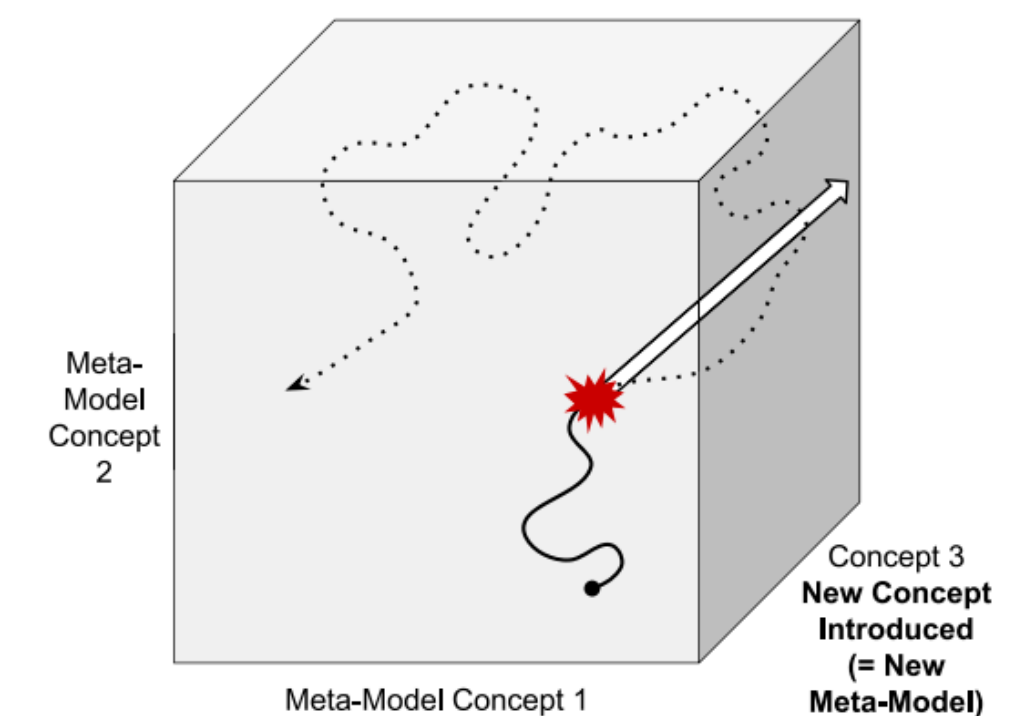
- = single process generates infinite complexity forever
- Routes to OEE [T Taylor] (cf. in Lenia):
  - Exploratory (small mutations), expansive (door-opening species), transformational (extensions)
- Maybe an important component to **AGI** [KO Stanley @OpenAI, T Mikolov @CTU]



(a) Exploratory Open-Endedness



(b) Expansive Open-Endedness

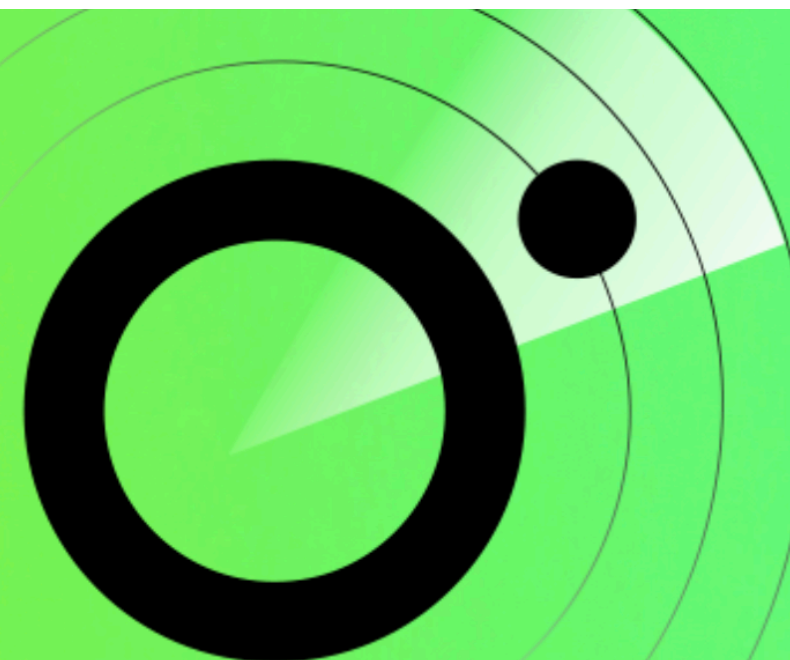


(c) Transformational Open-Endedness

Radar / AI & ML

## Open-endedness: The last grand challenge you've never heard of

While open-endedness could be a force for discovering intelligence, it could also be a component of AI itself.



By [Kenneth O. Stanley](#), [Joel Lehman](#) and [Lisa Soros](#)

doi:10.1162/artl\_a\_00290  
oreilly.com/radar/topics/ai-ml

# Life & ALife

- Emergence of **individuals / agents** & **macro-scale** colonies
  - How to quantitatively recognize individuals & macro-scales?
  - Use **information theory** [G Tononi, E Hoel, D Krakauer]
- Higher levels of emergence  $\times$  exploding diversity = open-ended evolution?
- Creating life phenomena **from scratch**
  - Implications to astrobiology & origin of life?



Thank you

`chakazu1.github.io/lenia`