

# Requirements for Open-Ended Evolution in Natural and Artificial Systems

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# (Informal) working definitions

Open-ended evolution is:

“evolutionary dynamics in which new, surprising, and sometimes more complex organisms and interactions continue to appear”

even more informally:

“a system where the continued evolution of novel forms is so interesting that the researcher is unwilling to press the ‘off’ switch”

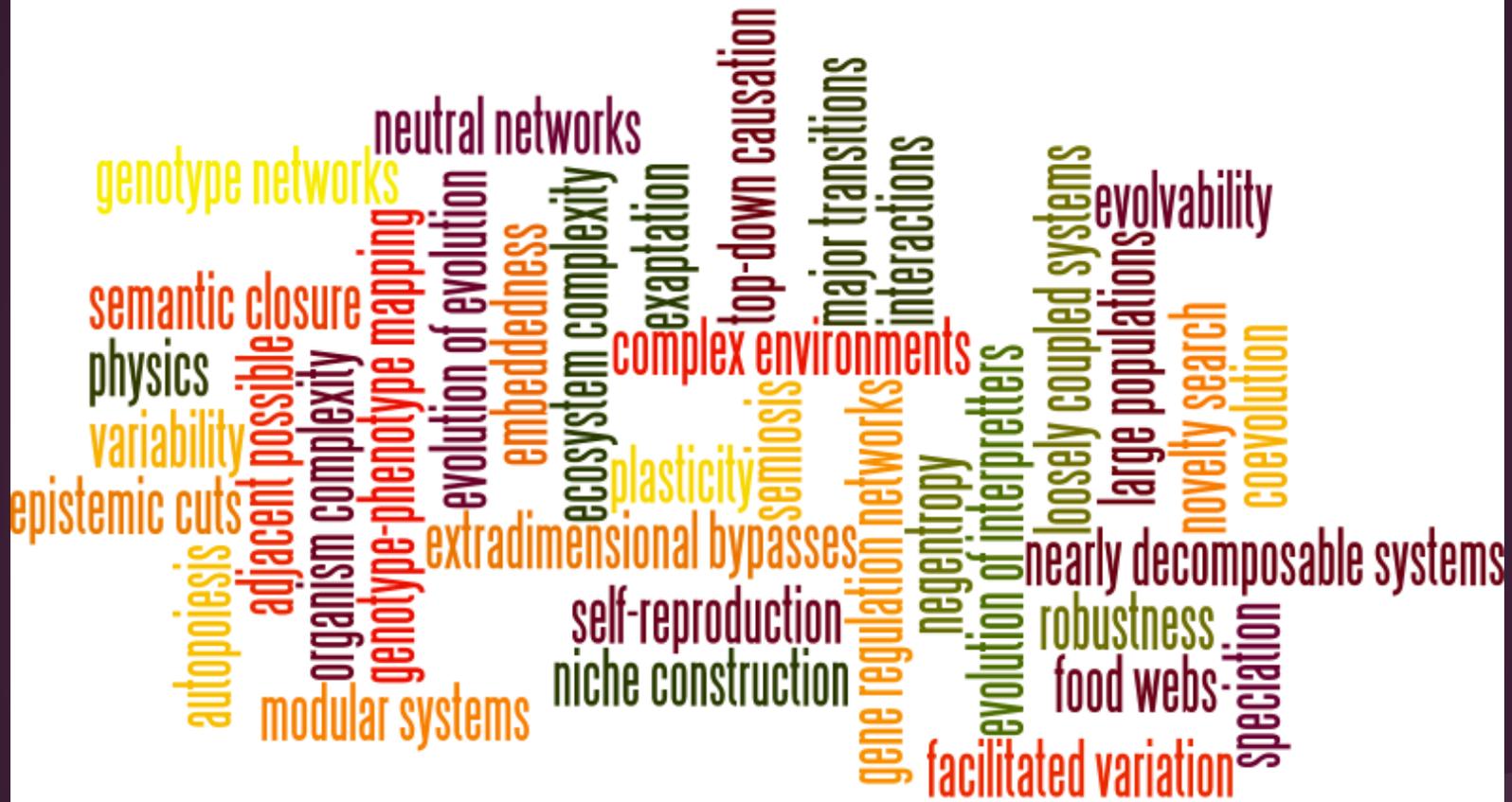
# OEE vs Evolvability

## Evolvability

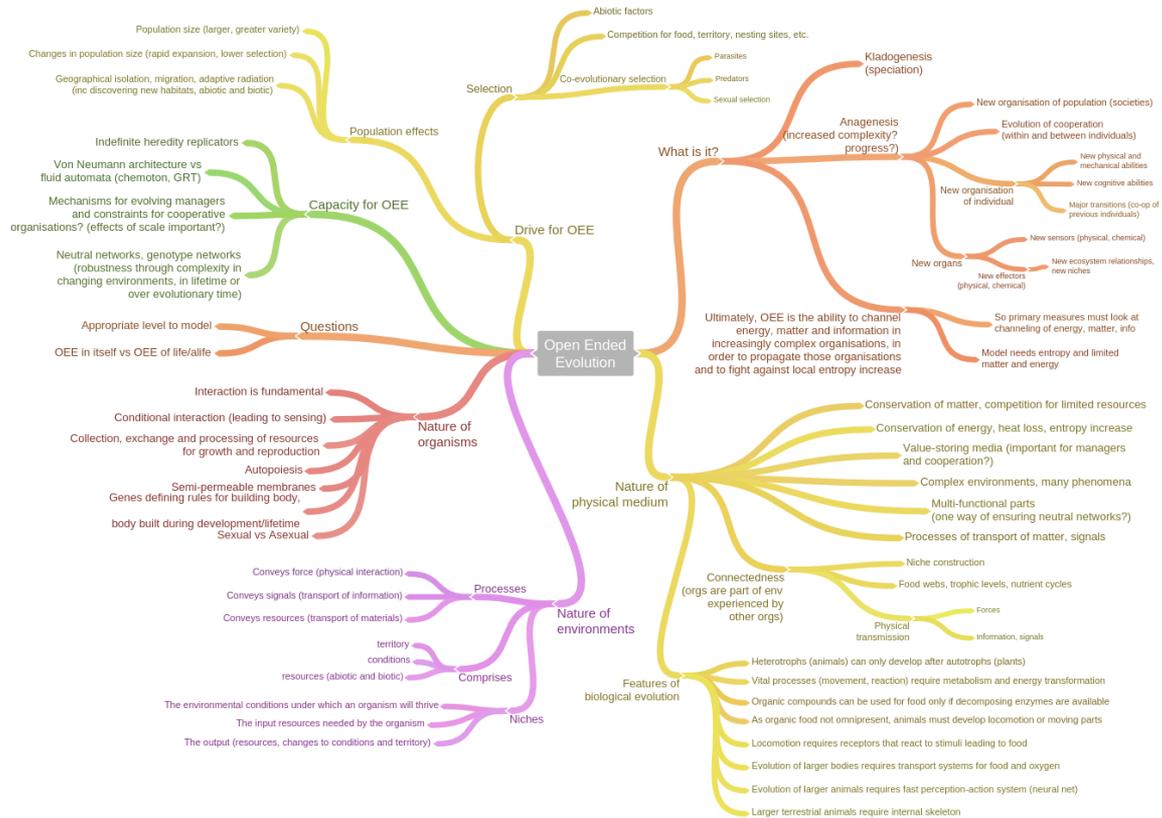
- the ability of a specific genotype-phenotype mapping to increase the proportion of favourable mutations

## Open-Endedness

- drive for on-going evolution
  - co-evolution
  - niche construction
  - utilizing the complexity of the environment
  - new forms of organisation



*Many concepts are relevant to OEE!*



*An initial attempt at organising concepts...*

# Five fundamental requirements

## #1 Robustly reproductive individuals

- *(Here we are talking about robustness of ecological individuals, not populations)*
- Von Neumann's self-reproducing cellular automata are not robust
- Tierra and Avida hard-wire robustness into the system
  - this limits evolutionary potential
- **What are the appropriate ways to achieve robustness in artificial life systems?**

# Five fundamental requirements

## #2 Individuals capable of producing more complex offspring

- Could be achieved in (at least) two different ways:
  - A **single individual** is capable of producing offspring of greater complexity than itself
    - e.g. **Von Neumann's solution** (interpreted/uninterpreted structure)
    - Implemented in Tierra, but interpreter is hard-coded and not evolvable
    - Also wish to evolve other aspects (e.g. genetic transmission, organisation of genome, mutation rates, etc): “evolution of evolution”
  - **Two or more individuals** are jointly capable of producing offspring of greater complexity than any one of its parents
    - **Horizontal gene transfer, symbiogenesis**. Much less explored in ALife systems

# Five fundamental requirements

## #3 Mutational pathways to other viable individuals

- Rensch's (1947) "improvements allowing further improvements"
- Much relevant work in recent literature
  - **Neutral networks**, genotype networks
  - **Evolvable G-P mappings**, facilitated variation
  - Evolution of **modular** / **loosely coupled** / nearly decomposable systems
  - Extradimensional bypasses, **exaptation**, multimodal bridges

# Five fundamental requirements

#4 A medium allowing the possible existence of a practically unlimited diversity of individuals and interactions

- **Complex environments**, “toy bricks”, “sorta” evolution
- What features of the environment are required for:
  - Not just evolving increased computational and **information processing** capabilities, but also:
  - Evolving new **sensors** and **effectors** (new inputs and outputs), an important part of biological OEE
  - And new **organisations** (major transitions)

# Five fundamental requirements

## #5 Drive for continued evolution

- (Natural) selection pressure from limited resources, competition, etc., creating an adaptive landscape
- Continued selection pressure through changing adaptive landscape
  - Individuals **being part of environment experienced by others**
    - leading to co-evolution, niche construction, ecosystem engineering, etc.
    - Connectedness: food webs, transmission of forces, signals: “just being there”
  - Also change through diffusion of species to new environments
    - (e.g. allopatric speciation)

# Five fundamental requirements

1. Robustly reproductive individuals
2. Individuals capable of producing more complex offspring
3. Mutational pathways to other viable individuals
4. A medium allowing the possible existence of a practically unlimited diversity of individuals and interactions
5. Drive for continued evolution

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