#### Division Blocks and the Open-Ended Evolution of Development, Form, and Behavior



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### Goal

- Explore, in silico, key interactions among development, form, physics, behavior (including reproductive behavior), and ecology that underpin biological evolution.
- How do these factors interact, under natural selection, to produce adaptive complexity?

# Open-Ended Evolution of Development, Form, and Behavior

- Wide repertoire of possible developmental trajectories, forms, behaviors, and ecological interactions.
- No pre-specified goals, just ecological interactions (possibly including aggregation and reproduction) within a resourcepreserving 3D physical simulation.
- Reproductive and aggregative behaviors also open-ended and may evolve.

#### Precursors

- Tierra
- Avida
- Echo
- Pushpop
- Sims's Creatures
- Framsticks
- Artificial Ontogeny
- SwarmEvolve 2
- Robotic/structural evolution
- Plant growth evolution

# Unfortunately Necessary

- Outrageous simplifications.
- Combinations of features normally observed at radically different scales.

#### SwarmEvolve 2











zero, plus, minus, energy, waste, exposure, pulse, rotx, roty, rotz, localtag, localenergy, localwaste, connectedtag, connectedenergy, connectedwaste, stemtag, stemenergy, stemwaste



sizex, sizey, sizez, jointx, jointy, jointz, stemx, stemy, stemz, tag, donationsize, donationtolerance, stemdonationsize, stemdonationtolerance, collectionsize, collectiontolerance, stemcollectionsize, stemcollectiontolerance, copyfidelity, mutationlimit, matecontribution, matetag, adhesion, pulserate, sigmoidcompression

#### Neural Network



- Arbitrary recurrent architecture, genetically controlled.
- Division (via growth) and genetics (mutation and crossover) controlled by network outputs.
- Sigmoid activation function; steepness controlled by an effector:  $\sigma(s) = \frac{2}{1 + e^{-cs}} - 1$

#### Skin



Patterns/colors show state. For results in paper:

- Dot density = energy
- Frame red = waste
- Frame green = energy donation tolerance
- Frame blue = energy donation size
- Dot red = sun exposure
- Dot green = waste collection tolerance
- Dot blue = waste collection size







# Reproductive Competence





#### Variations







- sun ——
- donation size ———
- - collection size ----
- collection tolerance ---
  - copy fidelity ———
  - mutation limit —
  - mate contribution —
- preferred mate difference ---
  - adhesion —————
  - pulse rate ——
  - sigmoid compression ----
    - blocks —
    - joints ——
    - joint/block ratio ———
      - compressed size -----



Figure 4: Averaged data from 40 runs of the Division Blocks system, collected after 1000 time steps of reproductive competence. Error bars indicate  $\pm 1$  standard deviation. A: average tag values; B: average donationsize (left) and donationtolerance (right); C: average stemdonationsize (left) and stemdonationtolerance (right); D: average matecontribution; E: average adhesion.

# Prospects

- Cluster-based parallelism in progress.
- Long term evolutionary patterns.
- Unbounded evolutionary activity?
- Track new measures of adaptive complexity.
- Physical division blocks?

