

# Modeling Cell Migration in a Simulated Bioelectrical Signaling Network for Anatomical Regeneration

Giordano Ferreira<sup>1</sup>, Matthias Scheutz<sup>1</sup>, Michael Levin<sup>2</sup>

[Giordano.ferreira@tufts.edu](mailto:Giordano.ferreira@tufts.edu)

<sup>1</sup>Human Robot Interaction Laboratory at Tufts University

<sup>2</sup>Allen Discovery Center at Tufts University

# Introduction

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- These tissues could fix a birth defect or induce remodeling of a damaged organ
- This is one of the goals of synthetic biology. A field that aims to design and engineer biologically parts, devices and systems

## Model Organism – Planarian Flatworm



# Model Organism - Planarian Flatworm

- Note that the shape to which an animal regenerates upon damage can be altered without genetic changes
- For example, it is possible to produce two headed planarian worms
- Genes and proteins involved in regeneration are known, but the exact mechanism of storing and using morphological information for regeneration is still unknown



# Computational Model of Morphology Discovery and Repair

- We previously developed a model that could discover the morphological information of an organism, during a discovery phase
- Later, when the organism was lesioned the dynamic messaging mechanism in the model was able to cause regeneration of the damaged parts
- The model has demonstrated a variety of functional properties of regeneration displayed by Planaria

## Features of the model

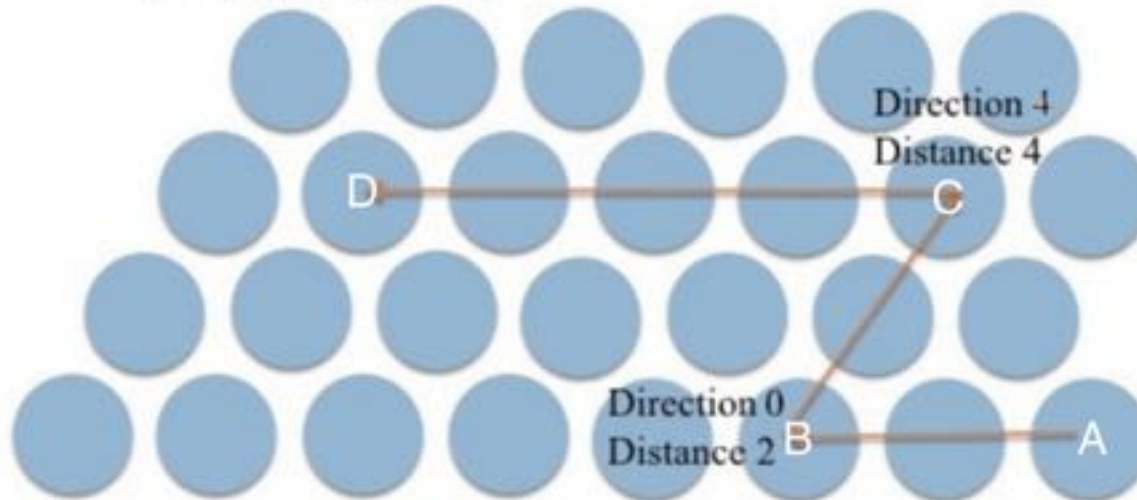
- Proposed in Ferreira et al. 2016 <sup>1</sup>
- Morphological information is stored in a dynamic distributed fashion across cells
- The genome is hypothesized to encode the computational machinery necessary for carrying out morphological discovery and repair
- A key feature of the model is that it can dynamically learn and maintain new morphologies using the same computational mechanism

<sup>1</sup> Ferreira, G. B. S., Smiley, M., Scheutz, M., and Levin, M. (2016). Dynamic structure discovery and repair for 3d cell assemblages. In *Proceedings of the Fifteenth International Conference on the Synthesis and Simulation of Living Systems (ALIFEXV)*



# Discovery

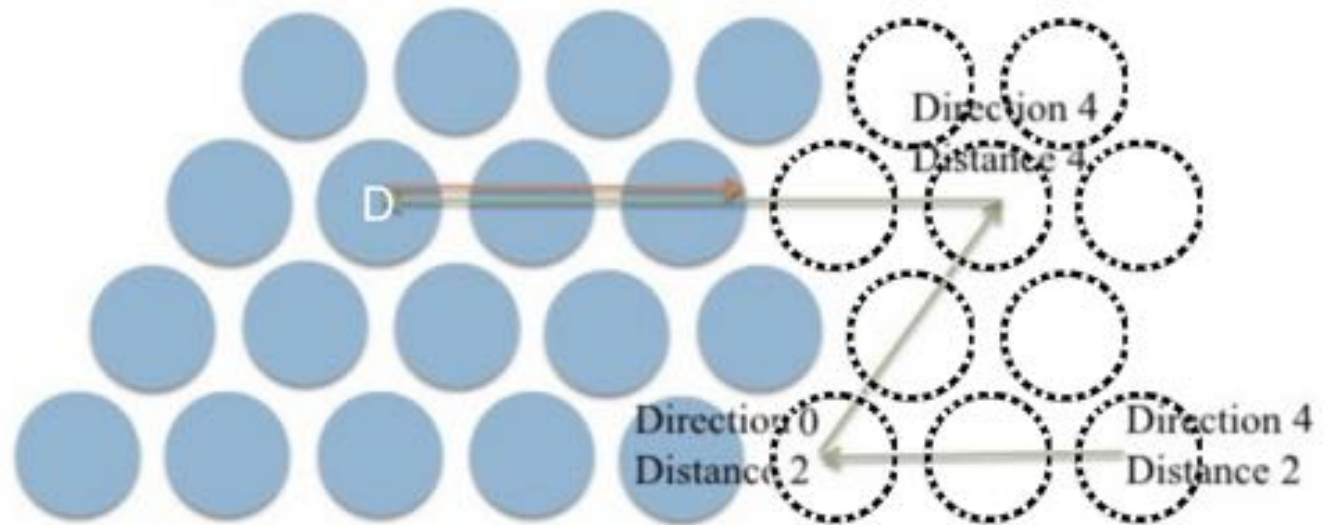
Packet: (4,4), (0,2), (4,2)



Cells send messages to other cells containing information about the path that those messages traveled.

# Regeneration

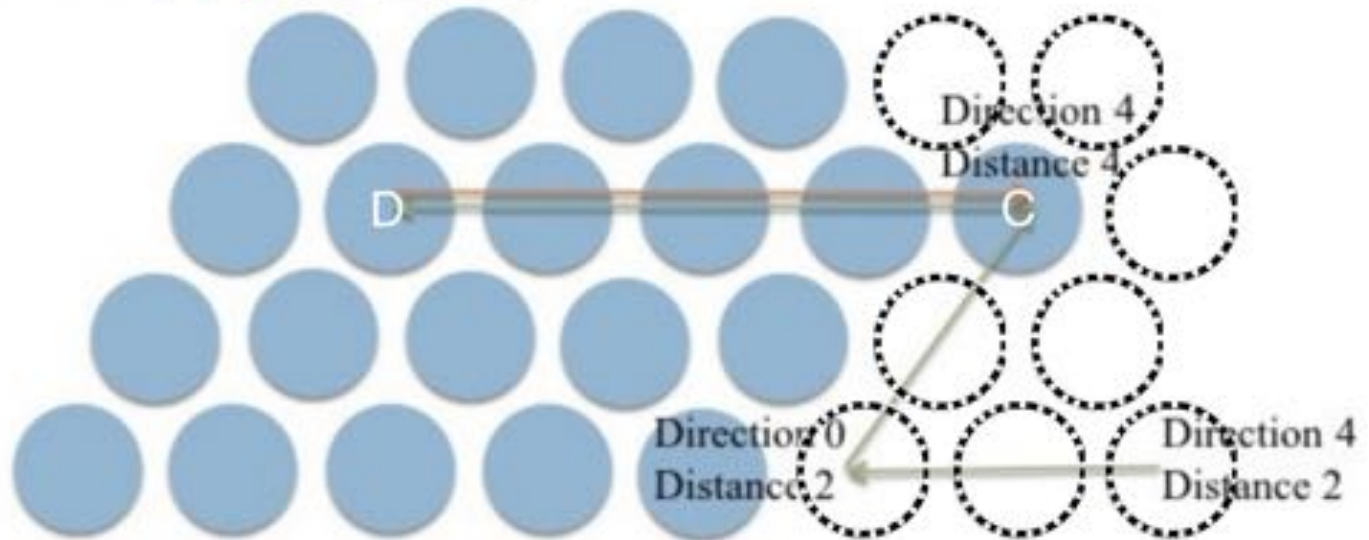
Packet: (4,4), (0,2), (4,2)



Then those message packets "backtrack" verifying if there exists a missing cell in the previous path, repairing it.

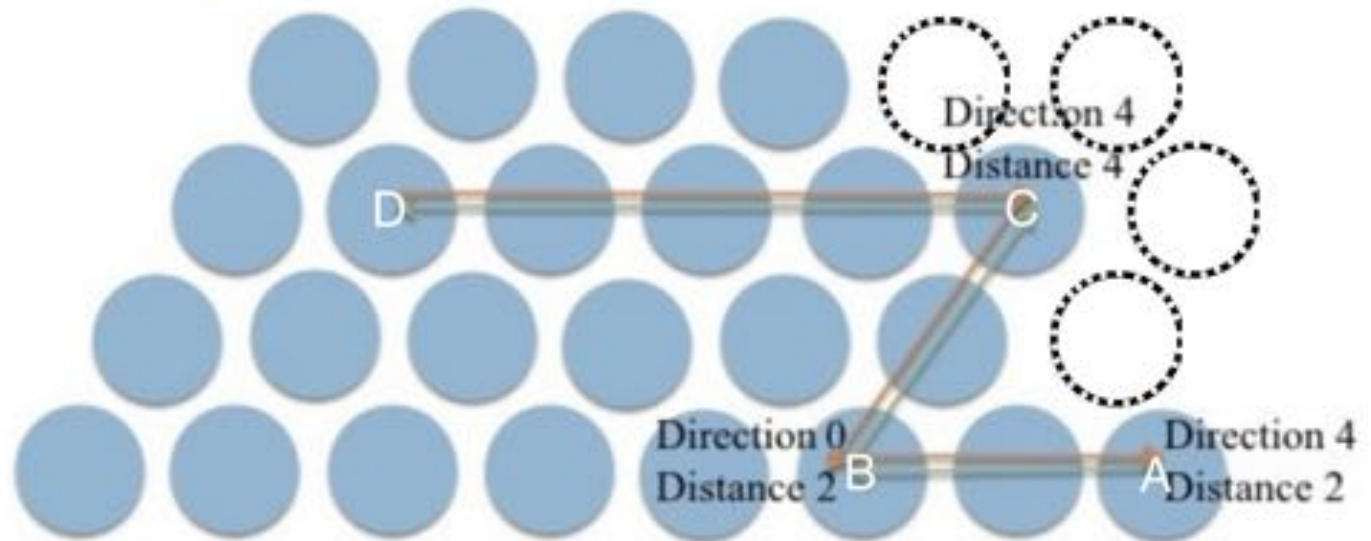
# Regeneration

Packet: (4,4), (0,2), (4,2)



# Regeneration

Packet: (4,2)



## Previous Findings

- In Ferreira et al (2016) <sup>1</sup> we showed that this model was capable of maintaining the structure of the worm indefinitely in the light of random damages happening to parts of it
- However, communication was assumed to be perfect and without losses, which is not realistic in any actual organism
- In Ferreira et al (2017) <sup>2</sup> we investigated our model of dynamic messaging morphology discovery and repair under various conditions of noise and proposed simple extensions to overcome the detrimental effects of noise

<sup>1</sup> Ferreira, G. B. S., Smiley, M., Scheutz, M., and Levin, M. (2016). Dynamic structure discovery and repair for 3d cell assemblages. In *Proceedings of the Fifteenth International Conference on the Synthesis and Simulation of Living Systems (ALIFEXV)*

<sup>2</sup> Ferreira, G. B. S., Smiley, M., Scheutz, M., and Levin, M. (2017). Investigating the Effects of Noise on a Cell-to-Cell Communication Mechanism for Structure Regeneration. In *Proceedings of the 14th European Conference on Artificial Life (ECAL 2017)*

## Adult Stem Cells – "Neoblasts"

- An explanation for Planaria's regeneration capabilities is the high number of adult stem cells (called "neoblasts") that exist in their body
  - Between 20% and 30% of cells in Planaria are neoblasts
  - Neoblasts are the only type of cells capable of dividing and differentiating into any other cell type
  - Worms with no neoblasts lose their regeneration capabilities

## Migration of Neoblasts

- There is evidence that signals coming from the wound guide neoblasts to the injury site.
- In a partially irradiated worm (e.g., with neoblasts existing only in the posterior part), regeneration does not start immediately following an anterior injury. Instead, it takes up to 4 weeks to create a mass of cells capable of differentiating into a head.<sup>3</sup>
- This suggests that neoblasts can migrate over long distances until they reach the area of the injury.

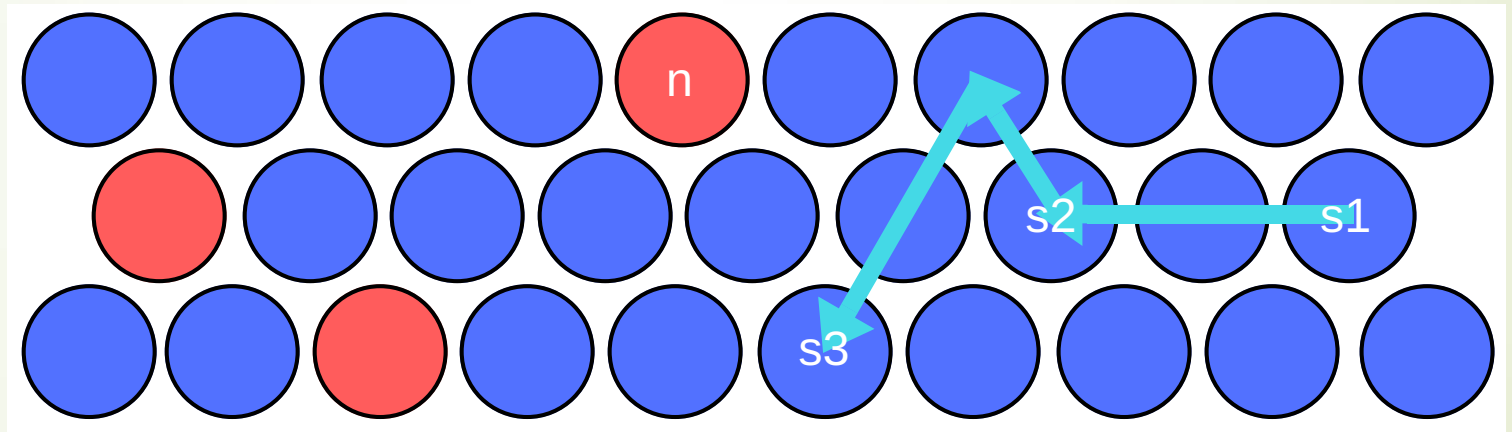
<sup>3</sup> · Wolff E, Dubois F. 1948. Sur la migration des cellules de régénération chez les planaires. Rev. Suisse Zool. 55:218–27

## Simulated Neoblasts

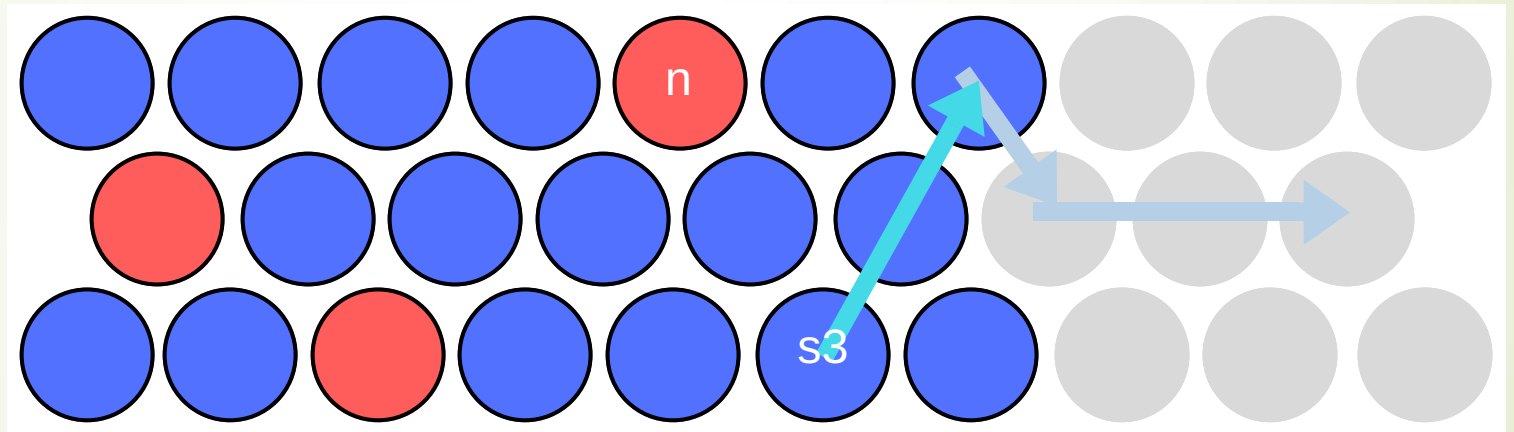
- In this work, there exist two cell types: neoblasts and somatic cells
- Only neoblasts are capable of dividing
- Somatic cells create migration messages that guide neoblasts to the injury area
- We want to test whether the worm can recover from an injury that removed half of its tissue



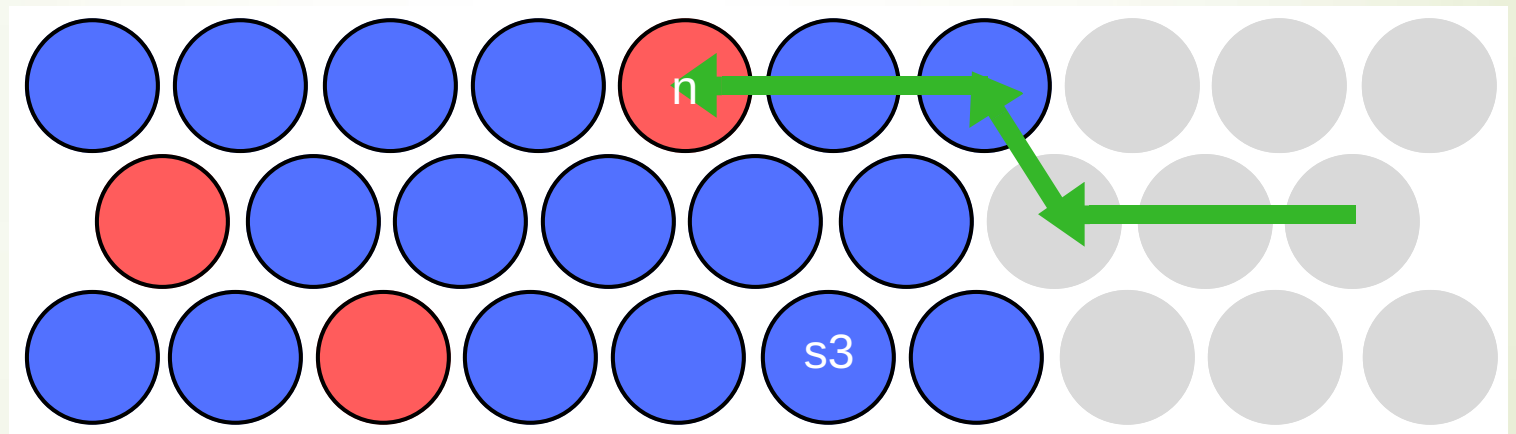
## Discovery With Neoblasts



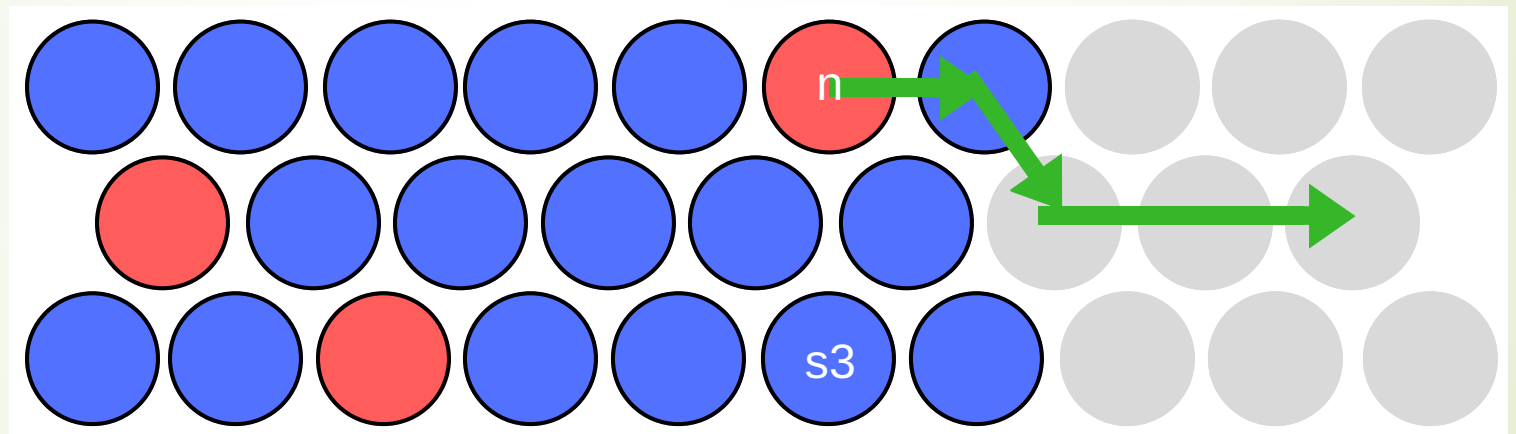
# Backtracking



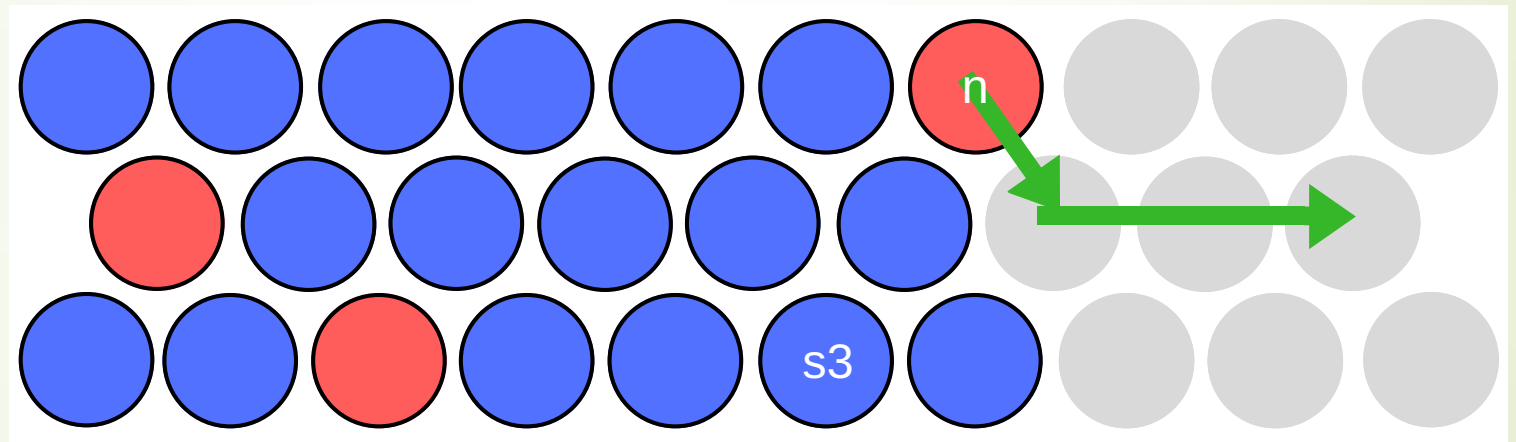
# Migration Message



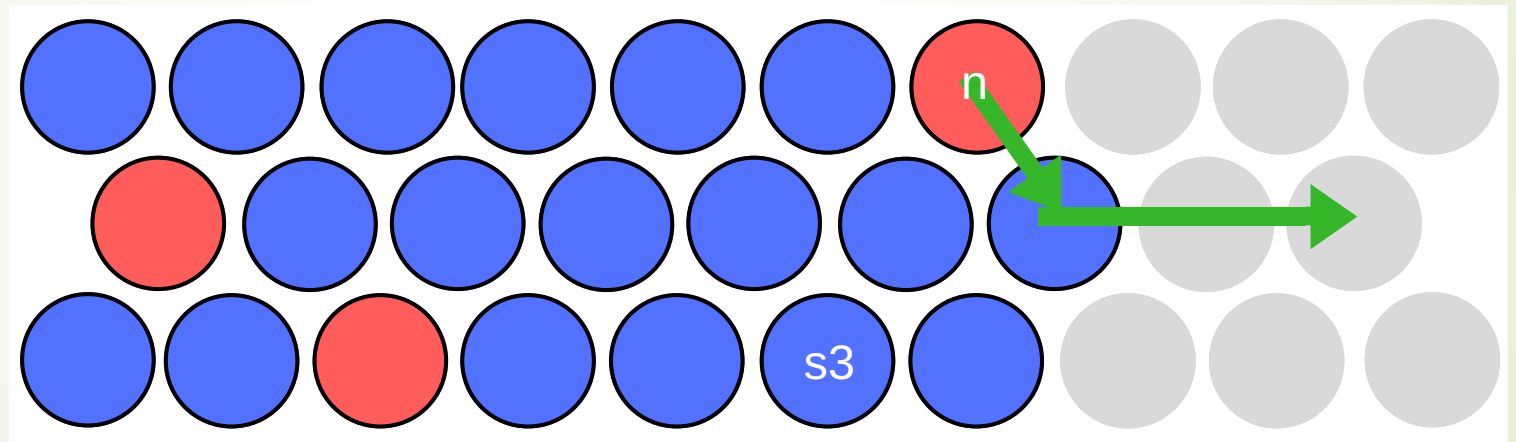
# Migration



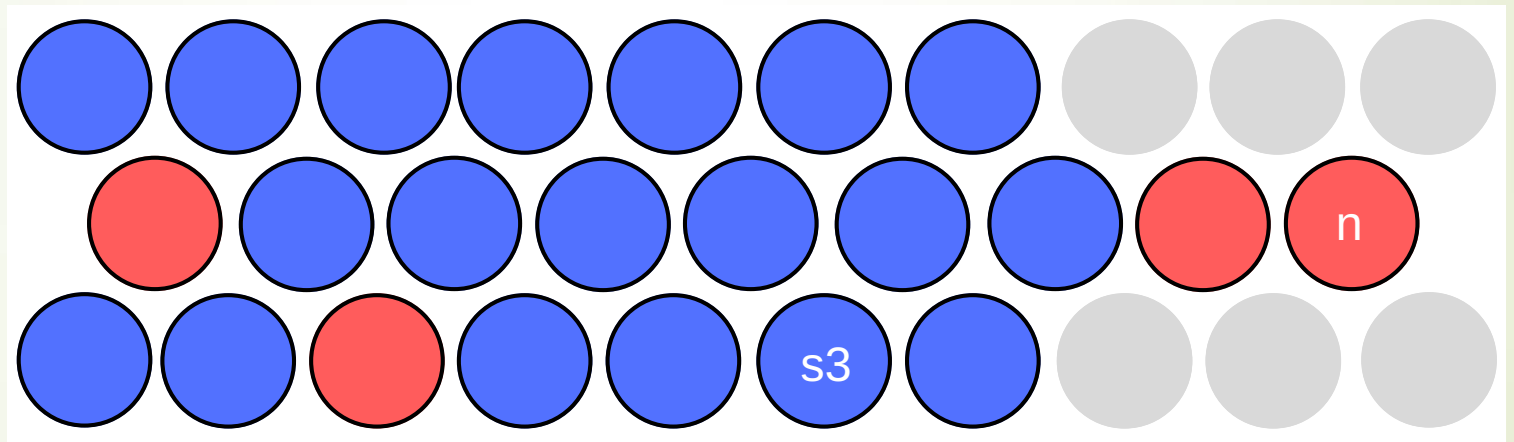
# Migration



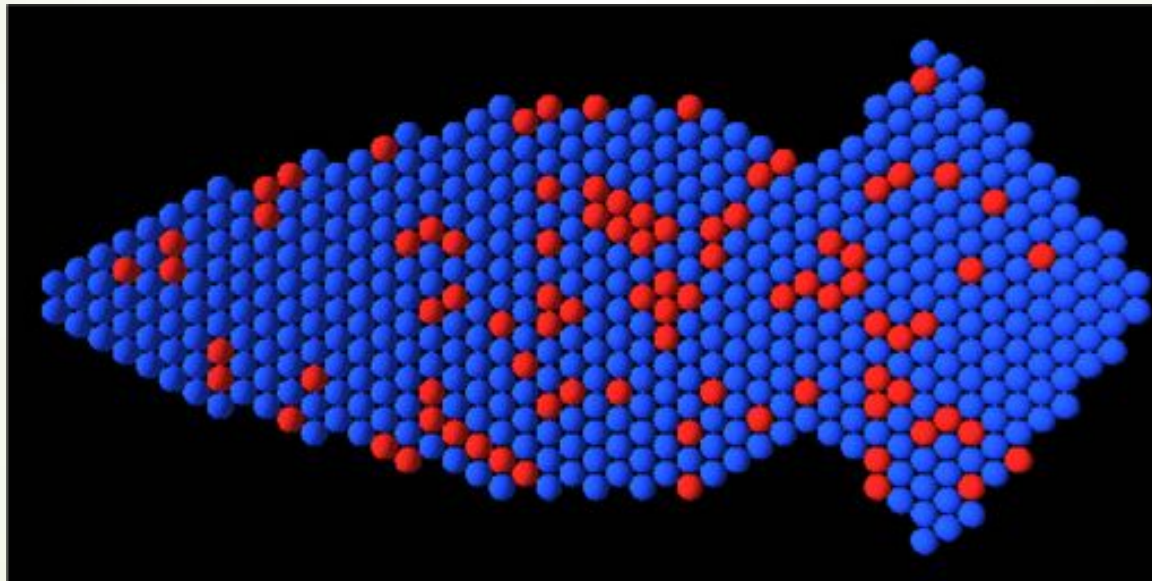
# Proliferation



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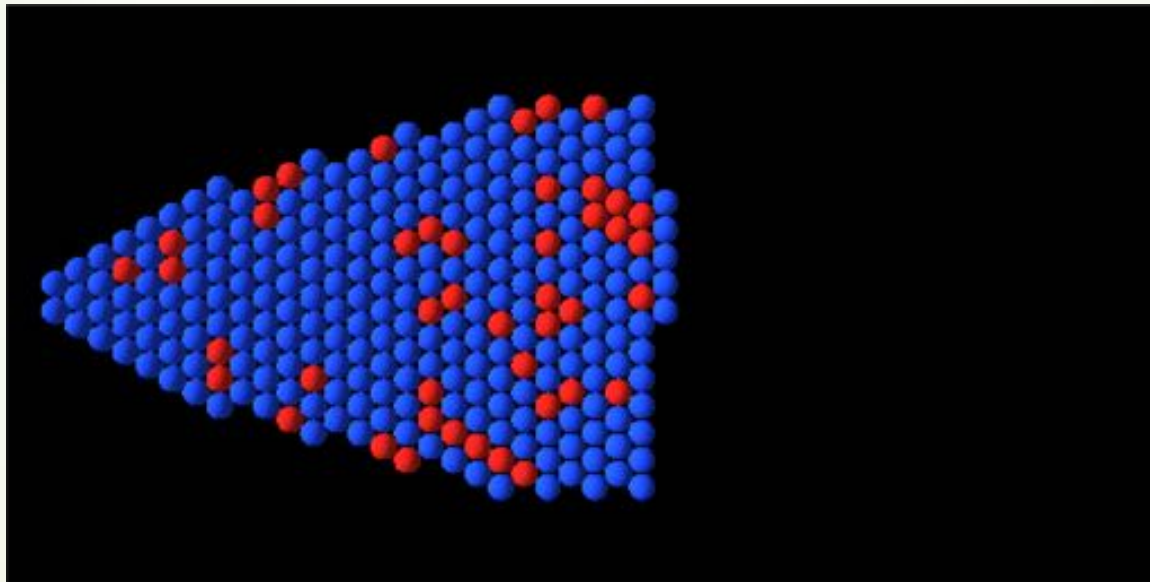


## Simulated Morphology

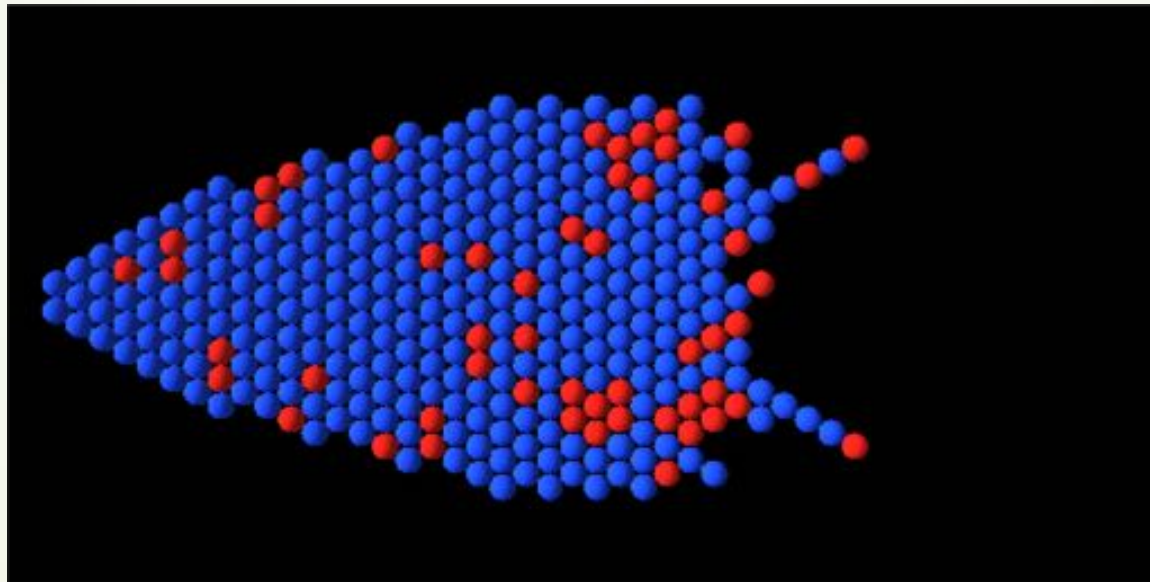




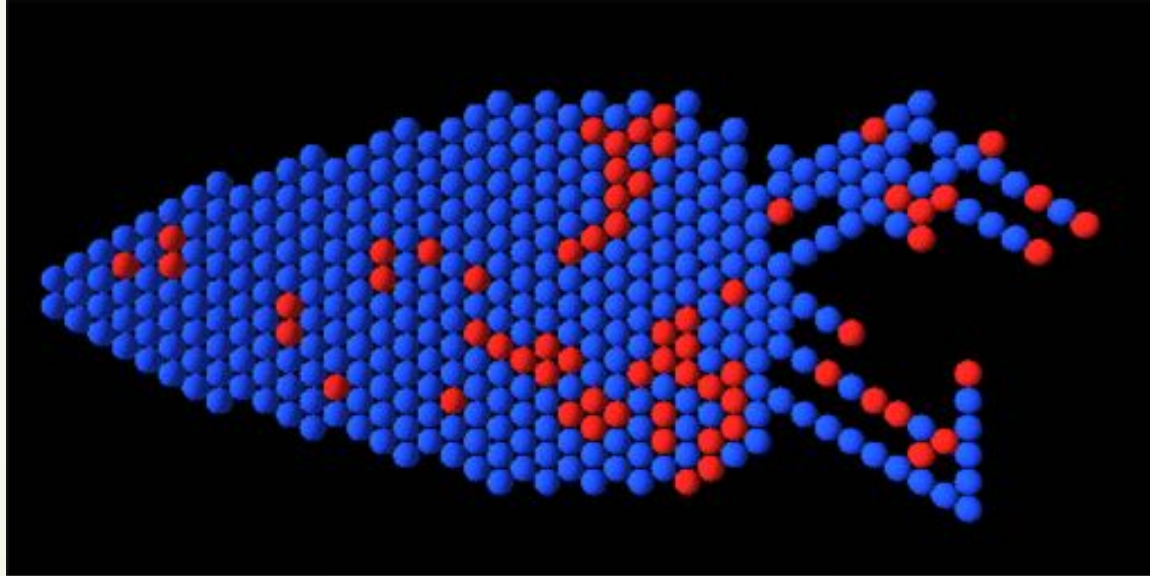
## Worm cut – Cycle 50



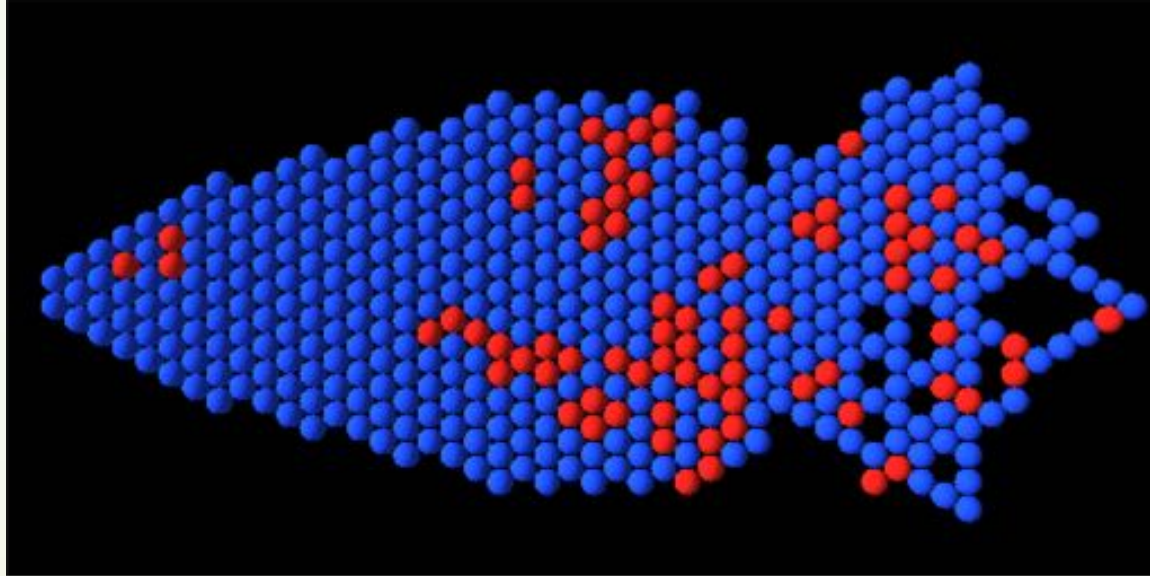
# Cycle 60



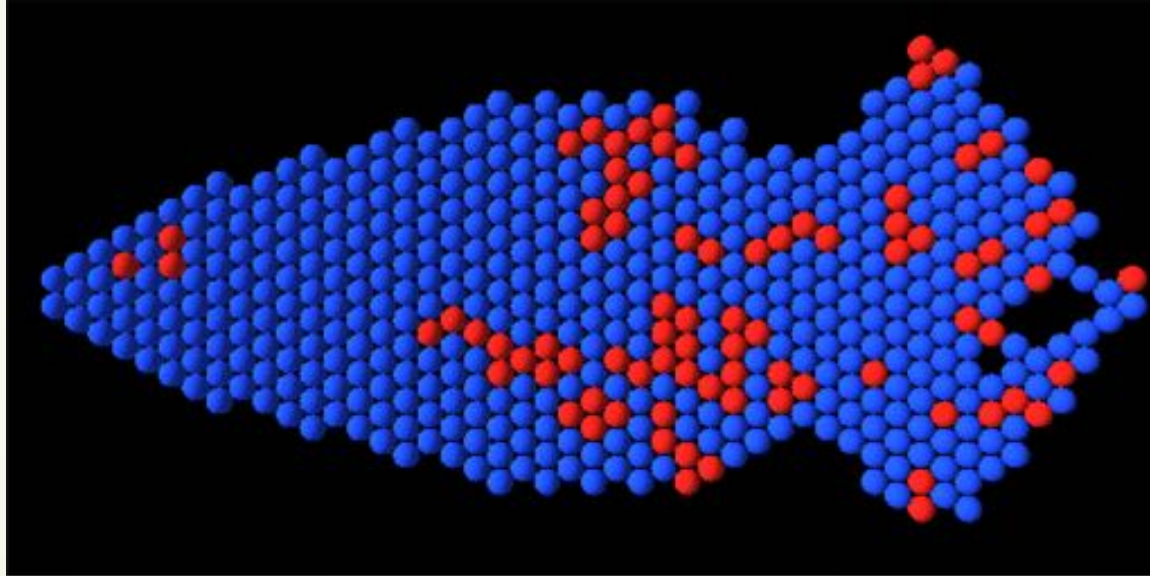
## CYCLE 70



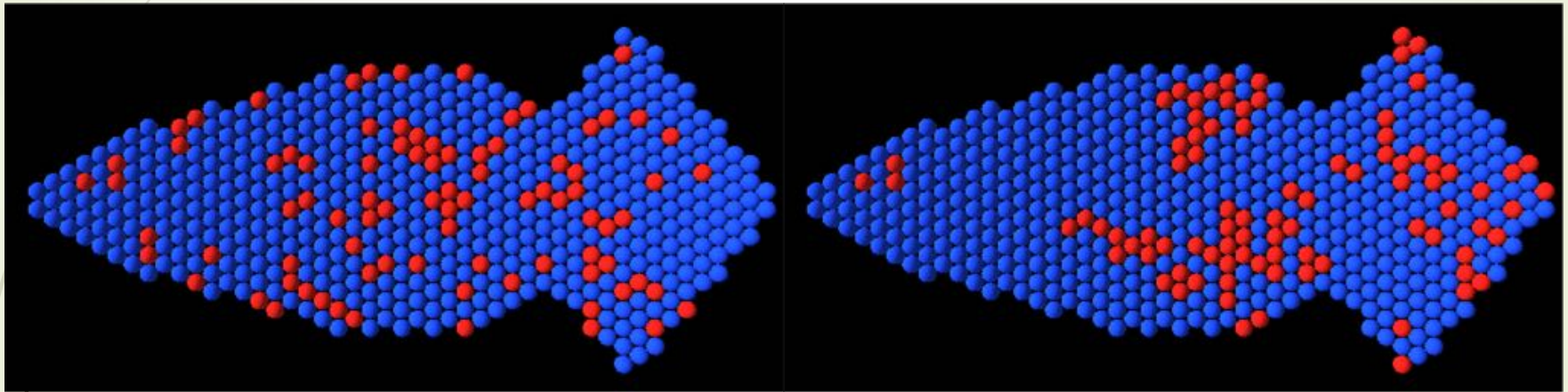
## CYCLE 80



## CYCLE 90



## End of the Regeneration Process



## Results – Full Regeneration

- The model completely regenerated the simulated worm in 19.56% (1565 out of 8000) of the parameter space



# Epimorphosis vs Morphallaxis

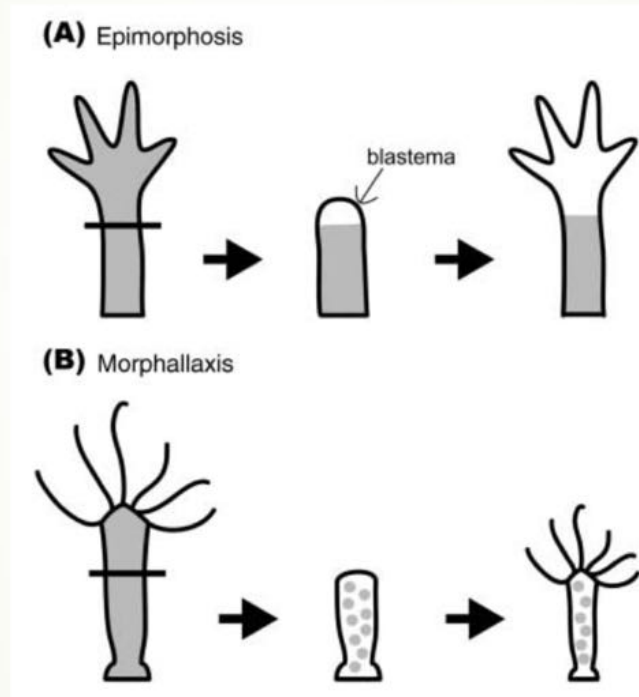


Image taken from: Agata, K., Saito, Y., & Nakajima, E. (2007). Unifying principles of regeneration I: Epimorphosis versus morphallaxis. *Development, growth & differentiation*, 49 2, 73-8.



## Conclusion

- In this paper, we expanded the capabilities of our model in two ways:
  - Restricted cell division to adult stem cells (neoblasts);
  - Added stem cell migration as a possible cell behavior
- Large parameter sweeps of the model determined that even for small ratios of neoblasts (10% for instance) the model was able to fully regenerate the original morphology
- As next steps, we want to make the model account for morphallaxis and also to investigate the robustness of the model against mutations.

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