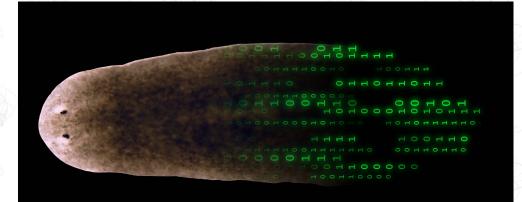
What Bodies Think About:

Bioelectric Computation Beyond the Nervous System as Inspiration for New Machine Learning Platforms

Michael Levin Allen Discovery Center at Tufts University <u>http://www.drmichaellevin.org/</u> <u>http://allencenter.tufts.edu</u>



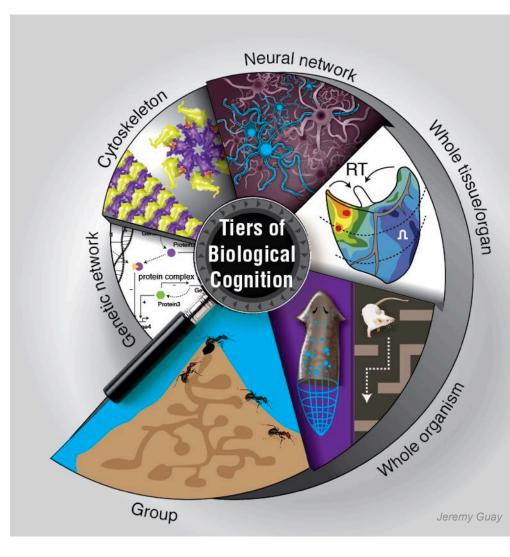






Main Message:

- Biology has been computing, at all scales, long before brains evolved
- Somatic decision-making and memory are mediated by ancient, pre-neural bioelectric networks across all cells
- Exploiting non-neural cognition is an exciting, untapped frontier for development of robust new AI platforms
- We are looking for experts in ML to collaborate with us to take bioelectrics beyond regenerative medicine



Outline

- Brain-body plasticity: processing info across brain and body
- Somatic cognition in the body: decision-making during selfediting of anatomy
- Bioelectric mechanisms of non-neural pattern control
- The future: regenerative medicine, synthetic living machines, novel AI architectures

Outline

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Behavioral Programs Adapt to Hardware Change

Holometabolous Insects

crawls, brain is chews liquefied, plants rebuilt

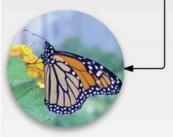
ed, drinks nectar lt

flies,

The butterfly has the caterpillar's memories despite radical brain reconstruction



Remodeling Event -Metamorphosis Pruning of many neurons to the cell body before generation of adult-specific brain regions and sensory structures.



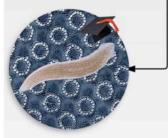
Behaviors Surviving Brain Remodeling

- Oviposition host plant preference based on larval diet
- Parasitic host animal choice based on larval diet
- Olfactory memory of larval environment
- Aversive training combining novel odors with punishment



Planarian Flatworms

Remodeling Event -Regeneration Regeneration of partial/full brain from remaining tail fragment following head amputation or fission.



Behaviors Surviving Brain Remodeling

- Classical conditioning light avoidance assay
- More rapid learning with naive animals through transfer of RNA/metabolic materials from trained individuals
- Recall of a familiar environment following head amputation





Remodeling Event -Hibernation Extensive pruining of dendritic trees of the brain during torpor (volume, spine length, spine number). Restoration of morphology shortly upon arousal.

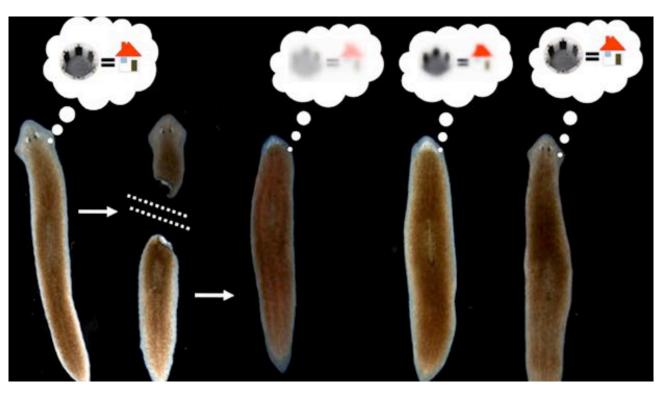


Behaviors Surviving Brain Remodeling

- Kin recognition
- Identification of familiar vs non-familiar individuals
- Retention of trained task: leaping between platforms, passing through a tunnel

Planarian Memories Survive Brain Regeneration

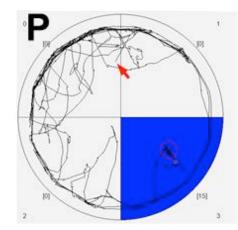
Memory stored outside the head, imprinted on regenerated brain



training -> memory decapitation

head regeneration

memory testing





Capturing the Public Interest

When I read that researchers trained flatworms, decapitated them, and discovered that after their heads grew back the worms had retained their training...

YOU TRAIN A

FLATWORM?

 \mathbf{D}



The Journal of Experimental Biology 216, 3799-3810 © 2013. Published by The Company of Biologists Ltd doi:10.1242/jeb.087809

RESEARCH ARTICLE

An automated training paradigm reveals long-term memory in planarians and its persistence through head regeneration

Tal Shomrat and Michael Levin* Biology Department and Tufts Center for Regenerative and Developmental Biology, Tufts University, 200 Boston Avenue, Suite 4600, Medford, MA 02155, USA *Author for correspondence (michael.levin@tufts.edu)

Communicative B LOGY

Volume 8 • Issue 5 • September/October 2015 The stability of memories during brain remodeling: A perspective

the stability of memories during brain remodeling. A perspective

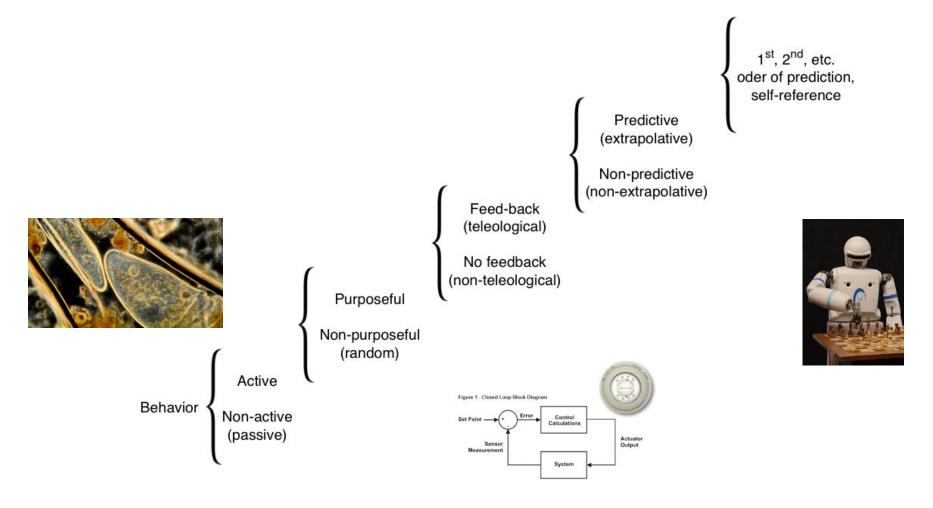
Deeglen J. Backlanen¹, Tai Skonnen^{1,5}, and Michael Levin^{1,6}. "Consists for graviers and Occurrence Fashign and Dynamic all Bridges Tails University Mallind, MA UM, "Depression of Researchings Ukannan-"Sense for Segments and Ukan Segment Fashign and Dynamic Tails", Scholler Marce Segments and Segment Andreas Mallement. Incl

3799

Outline

- Brain-body plasticity: processing info across brain and body
- Somatic cognition in the body: decision-making during selfediting of anatomy
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Wiener's Levels of Cognition



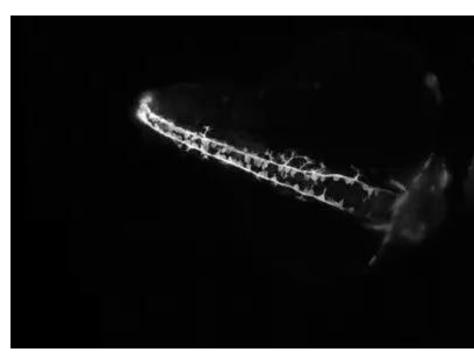
Unicellular organisms robustly achieve physiology, patterning, and behavior goals



1 cell no "brain" Cells did not lose their smarts when joining up to form multicellular creatures; they broadened their (computational) horizons – increased the boundary of the "self" – the borders of what they measure/control



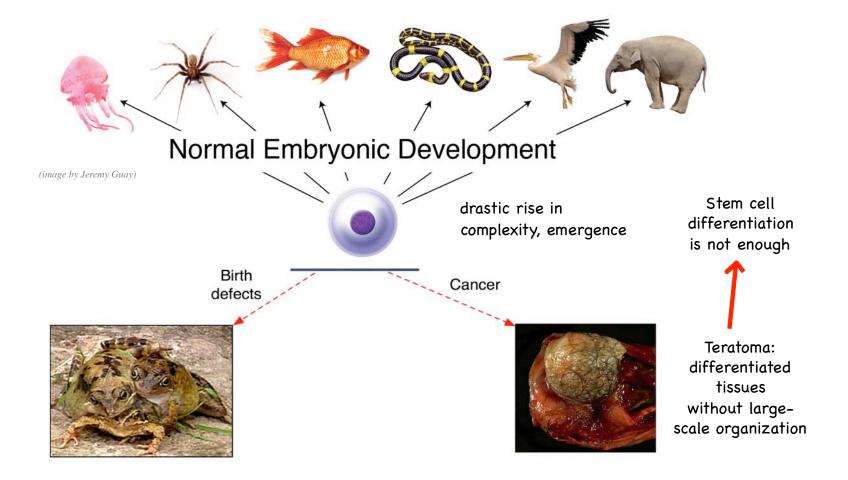
frog embryo developing



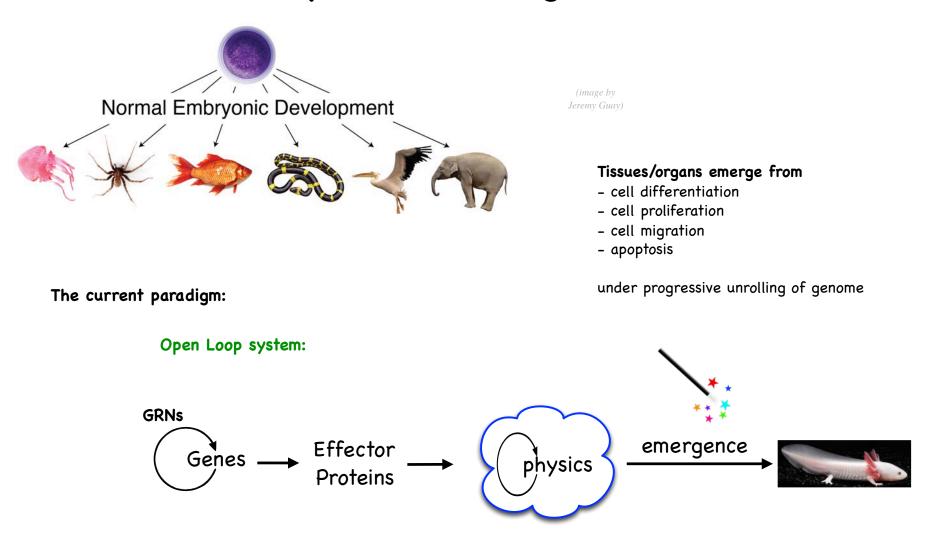
Nervous system developing

Elizabeth Haynes & Jiaye He

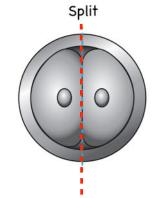
Embryogenesis: reliable self-assembly



Development: initial generation of form



Embryogenesis is reliable, but not all hardwired – – regulation after drastic perturbation







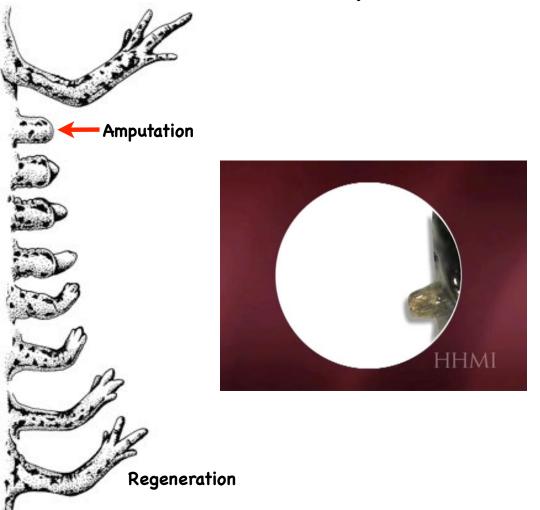


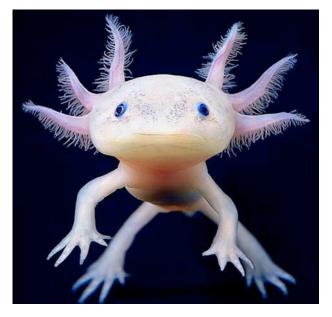
(image by Jeremy Guay)



Combining 2 embryos gives 1 normal organism

Regeneration: rebuild the target morphology after unpredictable deformations, then stop

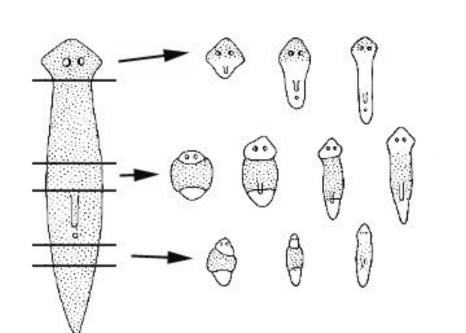


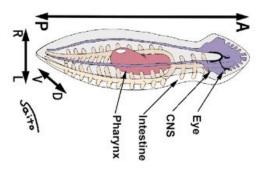


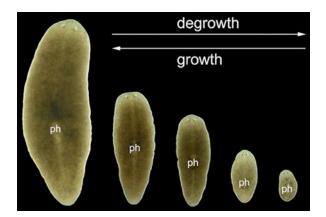
Axolotl – a complex vertebrate that regenerates limbs, eyes, jaws, portions of the brain, heart, and tail, including spinal cord, muscle, and other tissues.

Planarian Regeneration: restoring global order









Precise allometric rescaling, immortality!

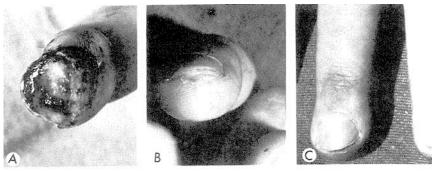
Regeneration is not just for "lower" animals



The human liver is highly regenerative

Every year, deer regenerate meters of bone, innervation, and skin

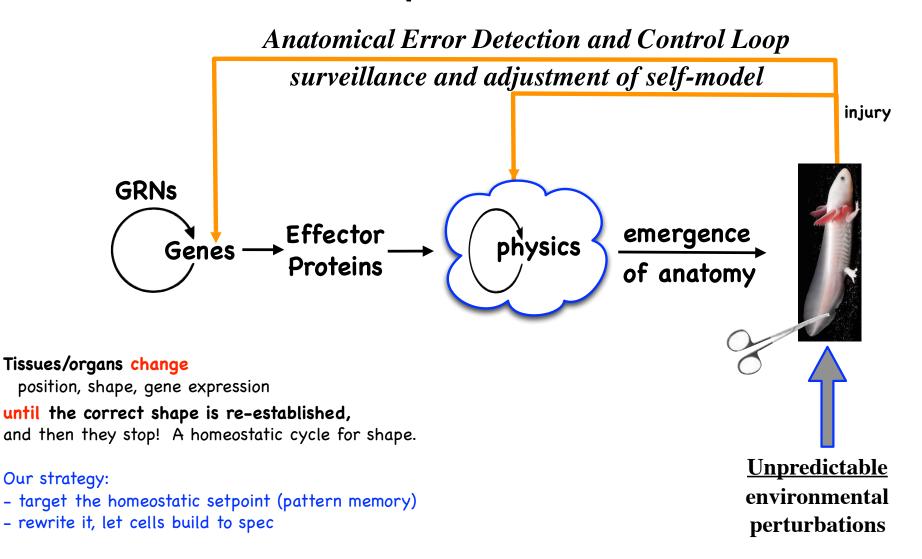




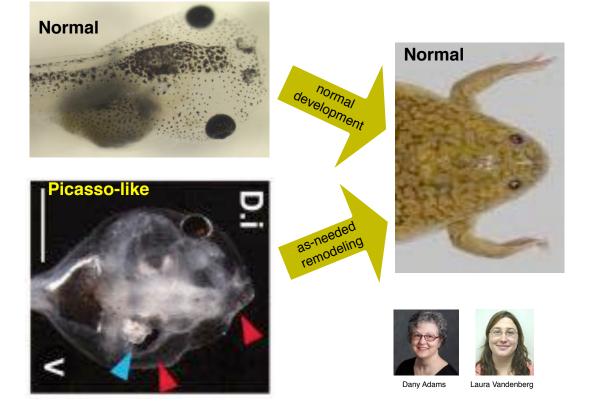
Human children below 7–11 years old regenerate fingertips

Fig. 2. (A) Amputation of finger tip in 5-yr-old girl. (B), (C) Twelve weeks after accident.

Closed Loop Pattern Homeostasis

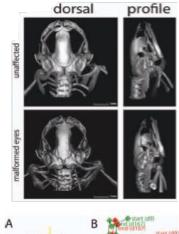


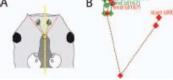
Remodeling until a "correct frog face" is made

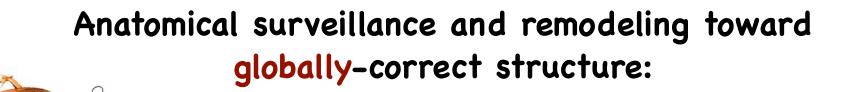


Cannot just follow a hardwired set of movements. How does it know when it's "right"? Change bioelectric prepattern Craniofacial mispatterning Metamorphosis

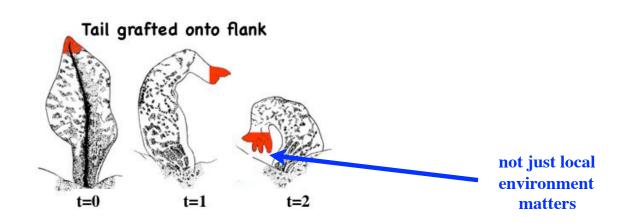
Morphometric analysis and modeling reveals: faces fix themselves!!





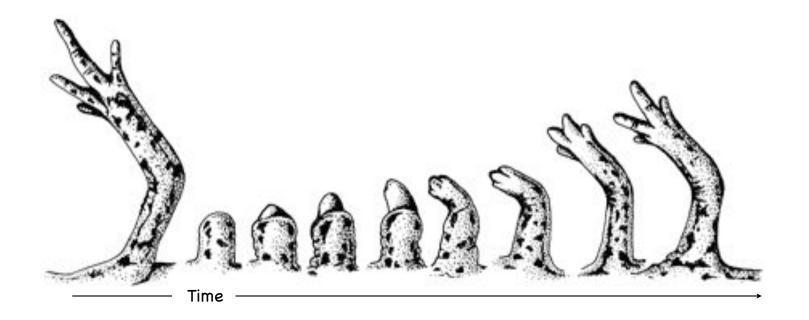


A tail grafted onto the side of a salamander remodels into a limb.

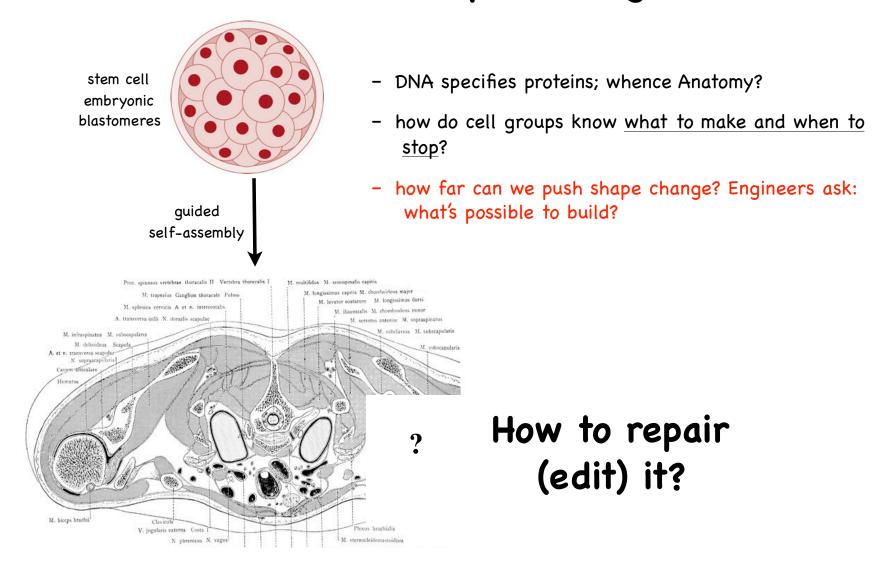


Fundamentally, regeneration is a computational problem:

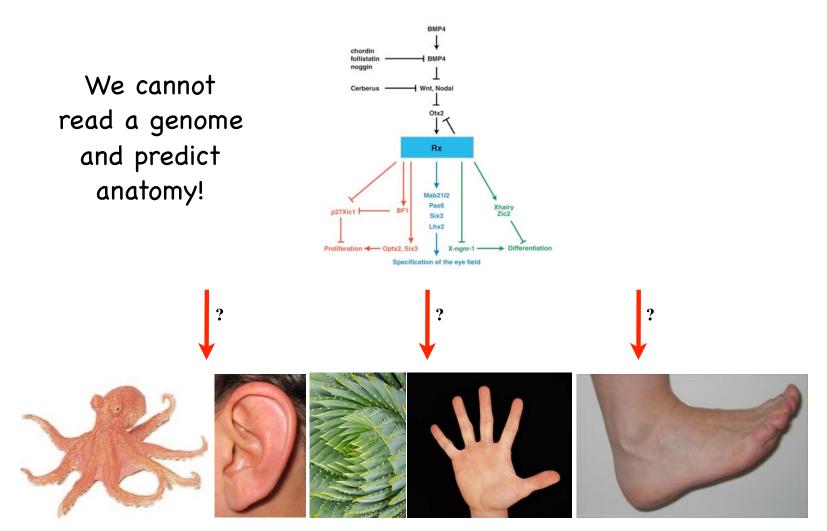
What shape do I need to have? (remembers goal) What shape do I have now? (ascertains current state) How do I get from here to there? (plans) When should I stop growing? (makes decision)



What determines patterning?



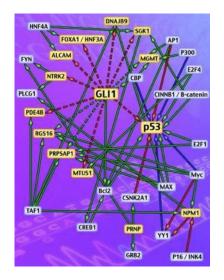
Knowledge gap:



Knowledge gap:

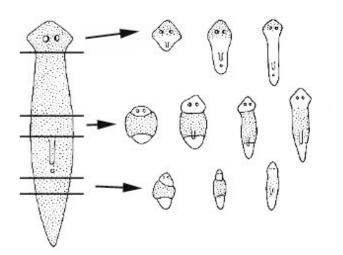


We want to fix a birth defect or induce shape change for regenerative repair.

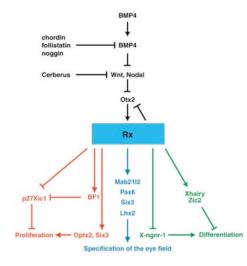


What to manipulate in this network, to get the shape change we want?!?

Knowledge gap:



You want to implement this remarkable ability in your robot:

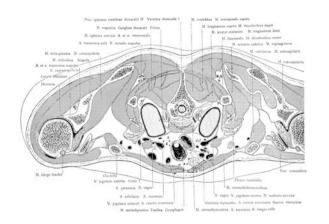


What aspects of this network are actually responsible for the shape-regulating property we want to copy in the robot?

The State of the Art

We are very good at manipulating molecules and cells <u>necessary</u> for complex pattern control A CONCALCANGANGAN ACCURATE AND A CONCALCANGE AND

We are a long way from understanding <u>algorithms</u> <u>sufficient for control of large-</u> <u>scale form</u> and function



can we move biology beyond machine code to address anatomical decision-making?

Key insights that allowed computer science to drive a revolution in information technology

<pre>"" TO QUIT. CONT FOR MORE. UNASSEMBLE ADDRESS: Ø3E5 93E5 2A0440 LD HL,(4004) 03E8 2B DEC HL 03E9 363E LD (HL),3E 03E8 2B DEC HL 03EC F9 LD SP,HL 03EC F9 DEC HL 03EE 2B DEC HL 03EE 2B DEC HL 03EF 220240 LD (4002),HL 03F6 ED56 IM 1 03F6 ED56 IM 1 03F6 FD210040 LD IY,4000 03F6 FD210040 LD IY,4000 03F6 FD210040 LD IY,4000 03F6 FD210040 LD IY,4000 03F6 FD210040 LD HL,407D 0400 217D40 LD HL,407D 0408 3676 LD (HL),76 0408 23 INC HL 0408 10FB DJNZ 0408 CONT </pre>	Kruskal($N, E, cost$) : sort edges in E by increasing $cost$ while $ T < N - 1$: let (u, v) be the next edge in E if u and v are on different components: join the components of u and v $T = T \cup \{(u, v)\}$ return T
Progress	

biology today

- Focus on information and control algorithms, not hardware
- Hardware-software distinction (device-independence)

Cognitive-like properties of pattern homeostasis

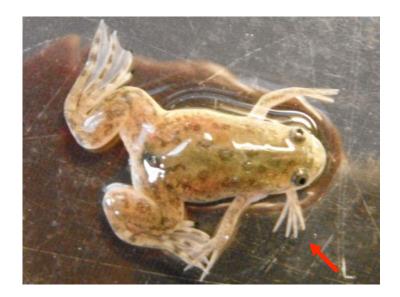
- Goal-directed behavior toward specific anatomical outcomes
- Flexibility (robustness) under variable conditions
- Global integration of cell functions into complex large-scale outcomes

if anatomical editing is a kind of memory process, the engram should be re-writable

Outline

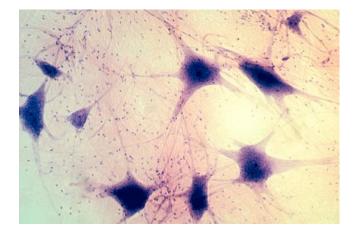
- Brain-body plasticity: processing info across brain and body
- Somatic cognition in the body: decision-making during selfediting of anatomy
- Bioelectric mechanisms of non-neural pattern control
- The future: regenerative medicine, synthetic living machines, novel AI architectures

Like the brain, somatic tissues form bioelectric networks that make decisions (about anatomy). We can target this system for control of large-scale pattern editing.

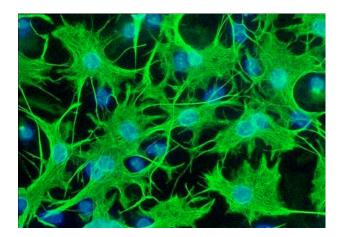




Brains did not Invent their Tricks de Novo



nerve circuits that compute, expect, learn, infer, make decisions, remember patterns



electrically-communicating non-neural cell groups (gap junctions = synapses)

- 1. Our unicellular ancestors already had synaptic machinery, ion channels, neurotransmitters
- 2. Neural computation evolved by speed-optimizing ancient computational functions of somatic cells

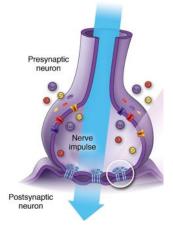


Hardware

gene products -> electric circuits

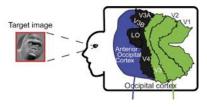


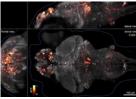
electrical dynamics -> memory



ion channels, electrical synapses

els, ical ses neural





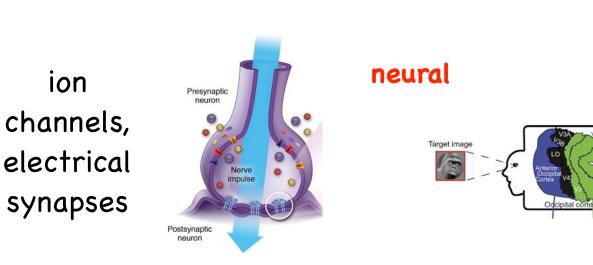
http://www.nature.com/nmeth/journal. v10/n5/full/nmeth.2434.html

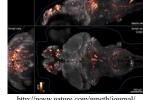
Hardware

gene products -> electric circuits

Software

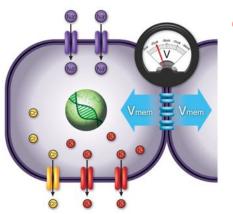
electrical dynamics -> memory





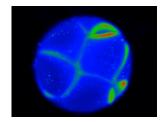
http://www.nature.com/nmeth/journal v10/n5/full/nmeth.2434.html

ion channels, electrical synapses

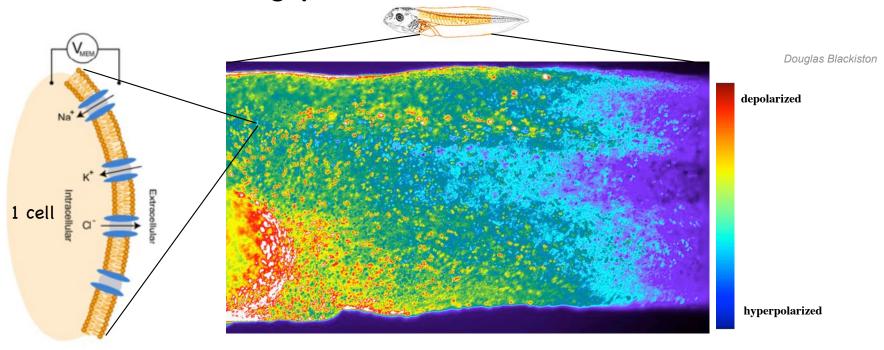


developmental

TBD



V_{mem} pattern = spatial difference of cells' resting potential across a tissue

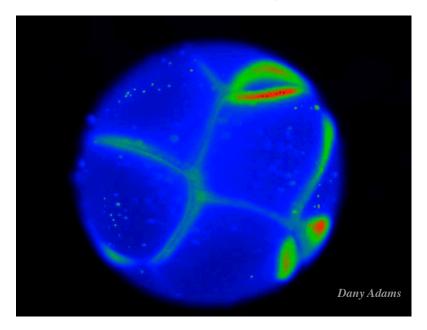


voltage dye reveals distribution of V_{mem} across intact Xenopus embryo flank (A-P gradient)

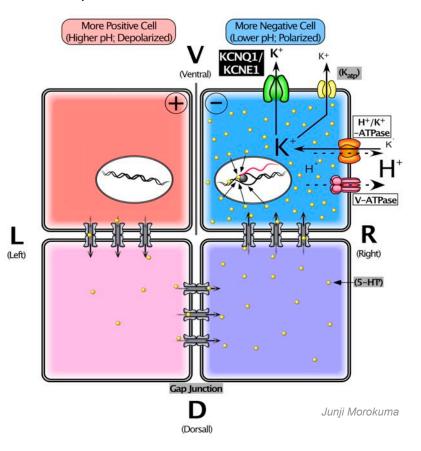
Bioelectrical signal = a change (in time) of spatial distribution of resting potentials in vivo

How we detect and model bioelectric signals:

<u>Characterization</u> of endogenous voltage gradients – direct measurement and correlation with morphogenetic events



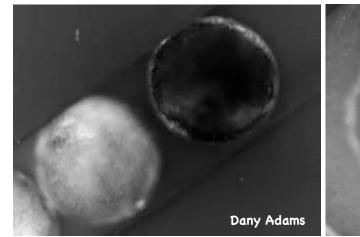
Voltage reporting fluorescent dye in time-lapse during Xenopus development <u>Quantitative computer simulation</u>: synthesize biophysical and genetic data into predictive, quantitative, often non-linear models



Eavesdropping on Computation during Patterning



craniofacial development "electric face" prepattern





hyperpolarized

depolarized

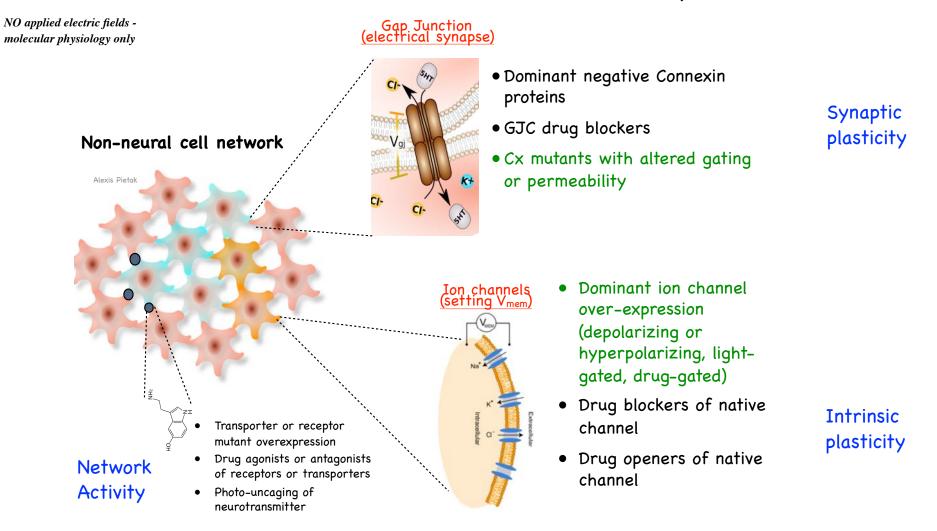


Bioelectric signature of cancer: defection to a unicellular boundary of self

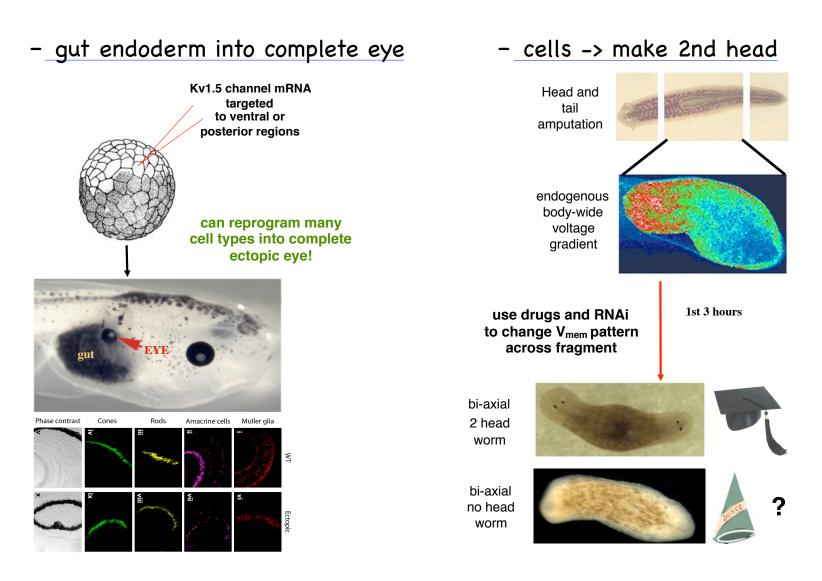


Manipulating Non-neural Bioelectric Networks

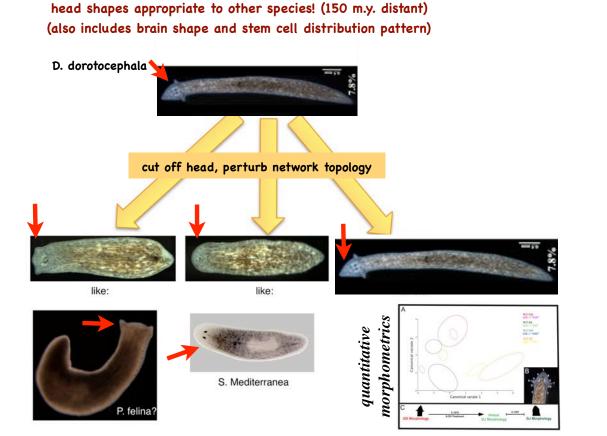
Tools we developed



Manipulation of V_{mem} enables organ-level reprogramming

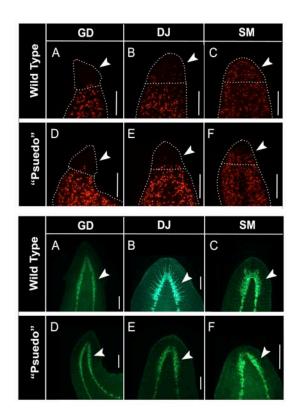


Bioelectric circuit editing over-rides default genomespecified target morphology and switches among species



Tweaking of bioelectric network connectivity causes regeneration of

brain shape and stem cell patterns change also!

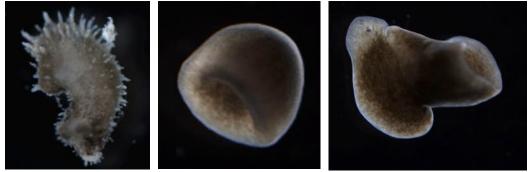


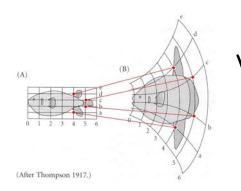
Drastic body-plan editing: flatworms, with a normal planarian genome, don't have to be flat!

Normal



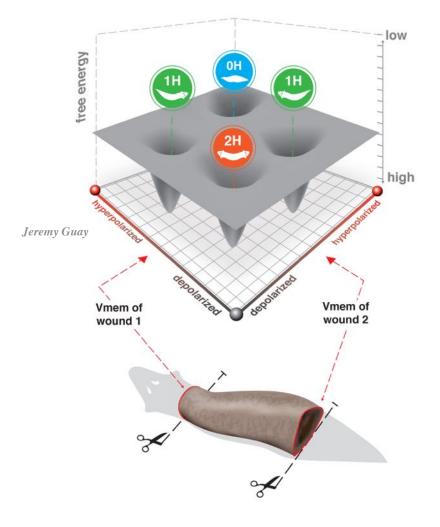
Bioelectric Circuit Altered After Bisection

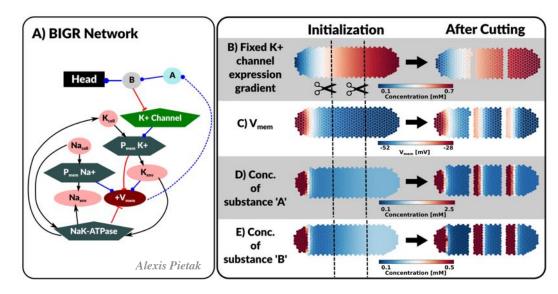




We can reach regions of the morphospace not explored by evolution, by changing electric circuits' dynamics in vivo Fallon Durant

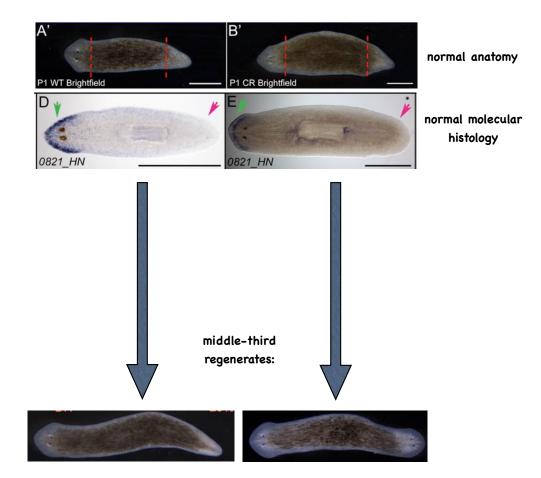
Global Pattern Control by Bioelectric Circuits





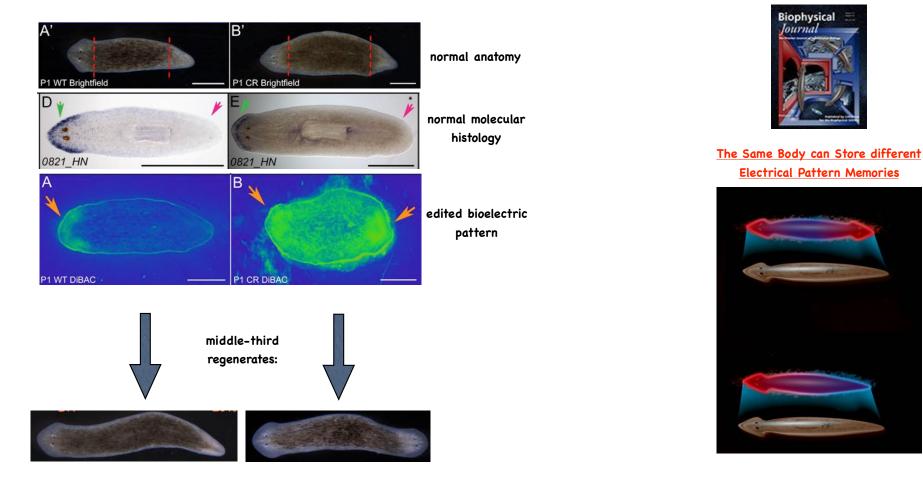
If information is in the dynamics of the electrical "software", we ought to be able to re-write goal states without editing the genomic hardware

Can Pattern Memory be Re-written??



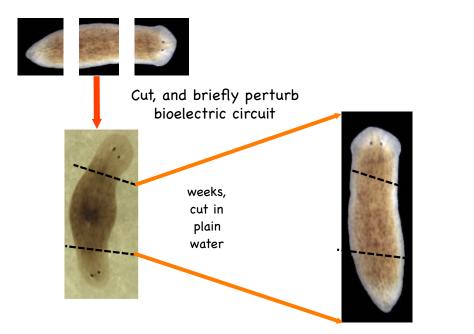
distinct anatomical outcomes despite identical, wt genomic sequence

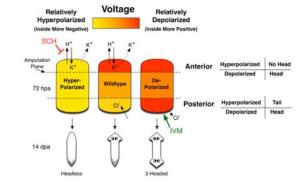
Revising the Patterning Engram



The bioelectric pattern doesn't indicate what the anatomy is now, it encodes the pattern that will guide anatomy **if** it is cut at a future time

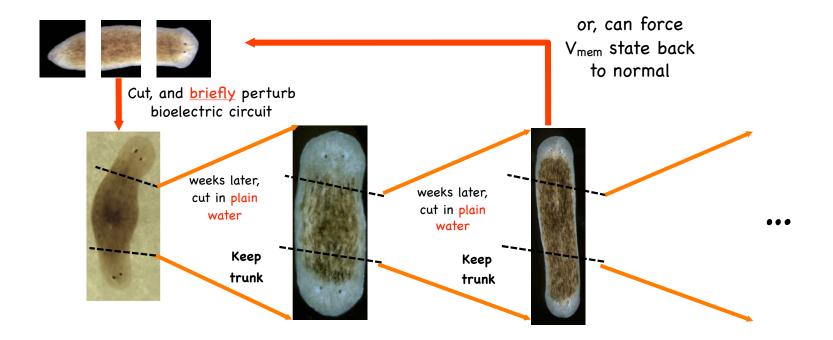
Long term: an organism's genome sets its long-term anatomy, doesn't it?





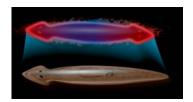
surely a normal worm must result once ectopic heads are removed in plain water (no more reagents), since genome is wild-type...

Transient re-writing of bioelectric circuit state permanently changes target morphology without genomic editing

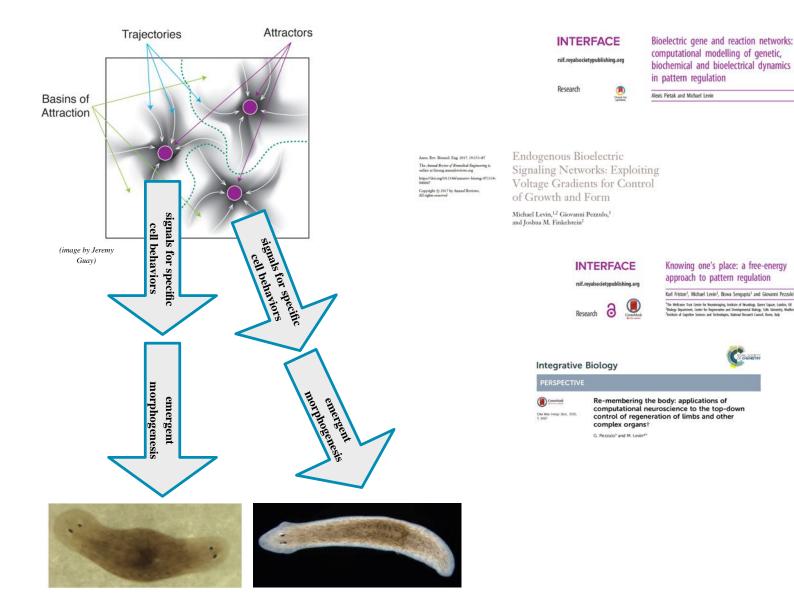


Basic properties of memory

- Long-term stability
- Lability (rewritable)
- Latency (conditional recall)
- Discrete possible outcomes (1H v. 2H)



- Non-neural bioelectric info-processing in all cells enables largescale anatomical decision-making
- Not micromanagement of cell fates but high-level goal (pattern memory) respecification
- Neural Net-like dynamics may allow non-neural tissues to maintain internal models of complex geometrical goal states
- We're extending connectionist models to pattern control



Exploiting bioelectric signals to trigger anatomical subroutines:

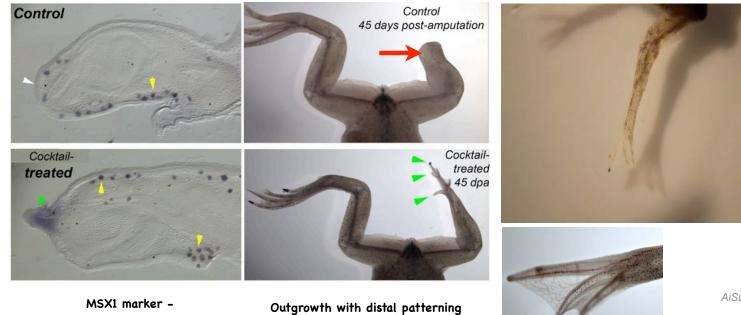
Mainstream approach: micromanage cell fates

blastema induced

Cognitive approach: re-write target state, let cells pursue the goal



The regenerated leg has both sensation and mobility:



induced (and still growing)

AiSun Tseng

Electroceutical cocktail + regenerative sleeve for 24 hours => 9 months of regeneration



Regenerative sleeve + cocktail



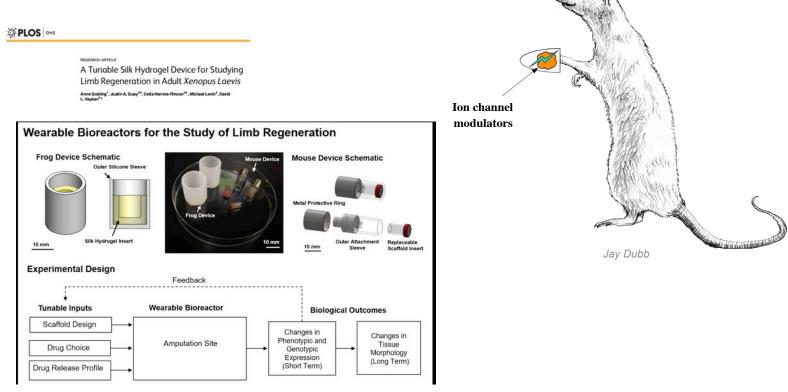
Cell Reports

Brief Local Application of Wearable Bioreactor Induces Long-Term Regenerative Response in Adult *Xenopus* Hindlimb

Celia Herrera-Rincon

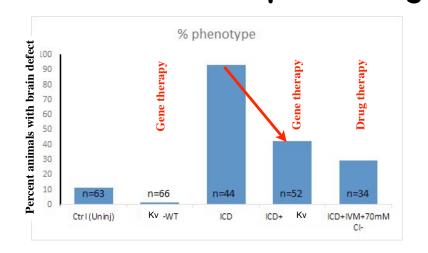
Next: mammalian applications

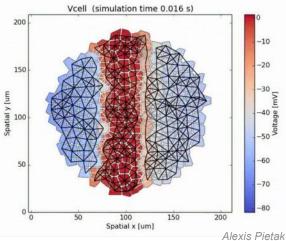
• Wearable bioreactors to deliver bioelectric state in vivo: a path to mammalian limb regeneration:



Annie Golding, David Kaplan's lab, Tufts BME

Bioelectric patterns over-ride genomic defects in vertebrate brain patterning





Normal tadpole brain





Normal tadpole brain resulting from hyperpolarization despite *Notch* mutation

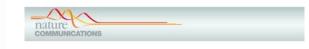


4366 • The Journal of Neuroscience, March 11, 2015 • 35(10):4366 - 4385

Development/Plasticity/Repair

Endogenous Gradients of Resting Potential Instructively Pattern Embryonic Neural Tissue via Notch Signaling and Regulation of Proliferation

Valiblav P. Pal, ¹¹⁰Joan M. Lemiter, ¹Jean-François Paré, ¹Gufa Lin, ¹Ying Chen, ¹ and Michael Levin¹ ¹Weing Department, Conter for Regnerators on Developmental Biology, Tults University, Medion, Masachasettu 2025–203 and ¹Stem Off Institu University of Materials, Missen 2016, Missensit 3535

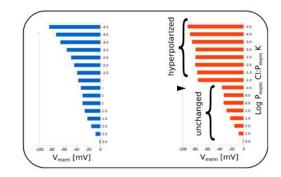


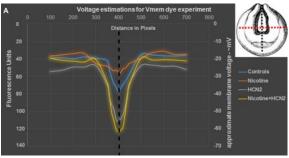
ARTICLE

HCN2 Rescues brain defects by enforcing endogenous voltage pre-patterns

Vaibhav P. Paig¹, Alexis Pietak¹, Valerie Willocq¹, Bin Ye², Nian-Qing Shi³ & Michael Levin¹

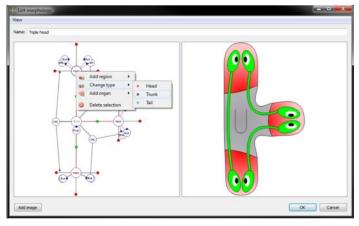
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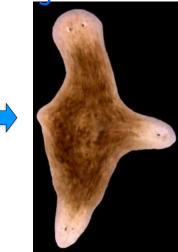




Evolution learned to exploit computational properties of electric circuits for large-scale anatomical homeostasis.

Cracking the bioelectric code => reprogramming biological software





Impacts on

- Cellular biophysics
- Regenerative medicine
- Cognitive neuroscience

- Primitive cognition
- Synthetic bioengineering
- Morphological computation
- Soft-body robotics

Outline

- Brain-body plasticity: seeing from a tail
- Somatic cognition in the body: decision-making during self-editing of anatomy
- Bioelectric mechanisms of non-neural pattern control
- The future: regenerative medicine, synthetic living machines, novel AI architectures

Could a highly-robust (non-brittle) ML roadmap be based on non-neural architectures? Seeking collaborators!

Somatic Cells: bone, heart, pancreas

BMC Cell Biology

Hypothesis

Long-term potentiation in bone – a role for glutamate in strain-induced cellular memory? Gary J Spencer* and Paul G Genever



Open Access

Calcif Tissue Int (2002) 70:435-442 DOI: 10.1007/s00223-001-1024-z

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Review

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PLOS ONE

Learning Theories Reveal Loss of Pancreatic Electrical Connectivity in Diabetes as an Adaptive Response

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Abstract

Cells of almost all solid tissues are connected with gap junctions which permit the direct transfer of ions and small molecules, integral to regulating coordinated function in the tissue. The pancreatic islets of Langerhans are responsible for secreting the hormone insulin in response to glucose stimulation. Gap junctions are the only electrical contacts between the beta-cells in the tissue of these excitable islets. It is generally believed that they are responsible for synchrony of the membrane voltage oscillations among beta-cells, and thereby pulsatility of insulin secretion. Most attempts to understand connectivity in islets are often interpreted, bottom-up, in terms of measurements of gap junctional conductance. This does not, however, explain systematic changes, such as a diminished junctional conductance in type 2 diabetes. We attempt to address this deficit via the model presented here, which is a learning theory of gap junctional adaptation derived with analogy to neural systems. Here, gap junctions are modelled as bonds in a beta-cell network, that are altered according to homeostatic rules of plasticity. Our analysis reveals that it is nearly impossible to view gap junctions as homogeneous across a tissue. A modified view that accommodates heterogeneity of junction strengths in the iset can explain why, for example, a loss of gap junction conductance.

Do Bone Cells Behave Like a Neuronal Network?

C. H. Turner,¹ A. G. Robling,² R. L. Duncan,¹ D. B. Burr^{1,2}

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Brief Review

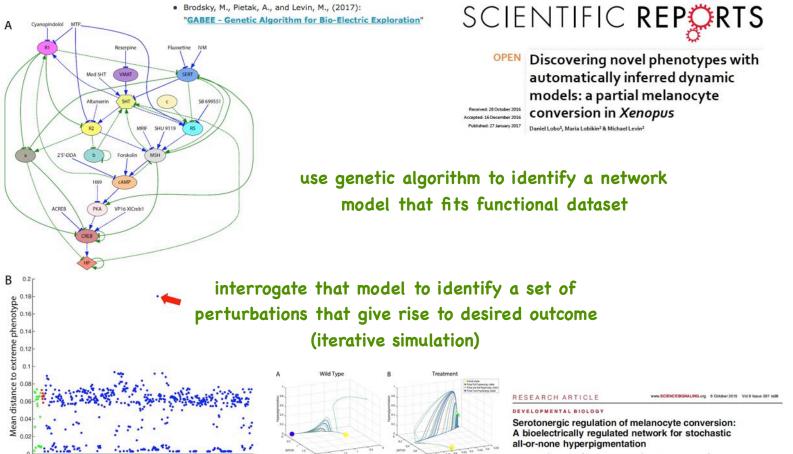
Cardiac Memory: Do the Heart and the Brain Remember the Same?

Mehdi Zoghi

Machine Learning Platform for model discovery and intervention prediction

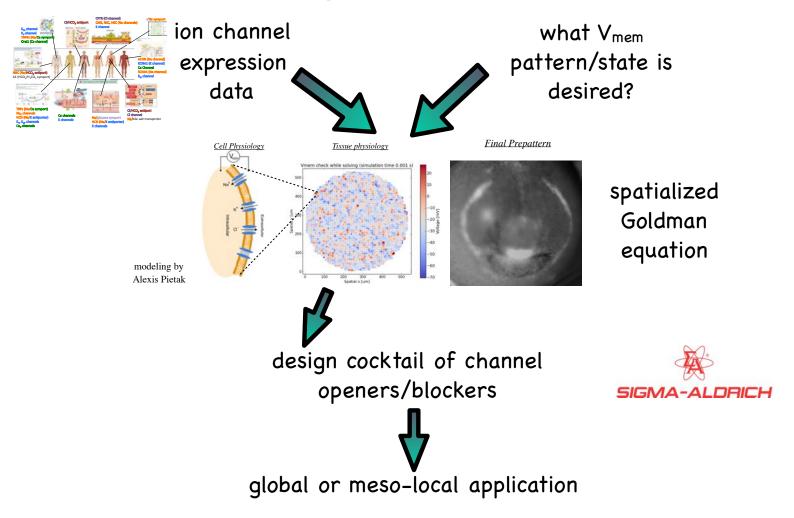
Micah Brodsky (Tufts University/MIT):

Experiments



Maria Lobikin,¹ Daniel Lobo,² Douglas J. Blackiston,¹ Christopher J. Martyniuk,³ Elizabeth Tkachenko,¹ Michael Levin¹*

Morphoceuticals: ion channel drugs that allow rewriting of bioelectric patterns



Thank you to:

Post-docs:

Kelly Tseng, Celia H-Rincon - bioelectricity of limb regeneration Nestor Oviedo, Wendy Beane - gap junctions, voltage, and planarian polarity Douglas Blackiston - brain plasticity
Juanita Mathews - information processing in somatic cell networks
Vaibhav Pai - voltage gradients and eye/brain induction
Daniel Lobo - symbolic modeling of regeneration
Douglas Moore - mathematical analysis of information processing

Students:

Technical support:

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Collaborators: Allen Center members +

Alexis Pietak - computational modeling of bioelectrics

 Dany Adams - V-ATPase in asymmetry & regeneration, craniofacial patterning
 David Kaplan - V_{mem} and human MSC differentiation, regenerative sleeves
 Fiorenzo Omenetto - optical approaches to bioelectric modulation
 Giovanni Pezzulo, Francisco Vico - cognitive science models of pattern regulation
 Vitaly Volpert, Chris Fields - mathematical models of pattern regulation
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 John Y. Lin, Thomas Knopfel, Ed Boyden - optogenetic control of V_{mem}
 Fabrizio Falchi, Hava Siegelmann - computational analysis
 Jack Tuszynski - biophysics/chemistry modeling

Model systems: tadpoles, planaria, zebrafish, chick embryos, computers

Funding support:

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Openings for post-docs and visiting scientists!

- 1) robotic bodies for biological systems
- 2) basal cognition memory and learning in cells
- 3) connectionist models of tissue decision-making
- 4) new AI platforms based on non-neural architectures
- 5) machine learning for patterning model inference
- 6) CS applications in bioelectrics, regenerative medicine in birth defects, regeneration, tumor reprogramming





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