

# Mechanistic modeling of developmental defects through computational embryology

Abstract #409

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# DISCLOSURES

## FUNDING:

US EPA/ORD Chemical Safety for Sustainability (CSS) Research Program

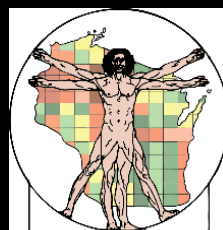
Contracts GS-35F-4550G (ASA) and 261D0054 (Leidos)

EPA/ORD/NCCT contract EP-D-13-053 with Vala Sciences

EPA/ORD/NCCT contract EP-D-13-055 with Stemina Biomarker Discovery

EPA/ORD/NCCT contract EP-D-13-056 with ArunA Biomedical

Organotypic Culture Models for Predictive Toxicology Centers (EPA/STAR)



**DISCLAIMER:** The views expressed are those of the presenter and do not reflect Agency policy.

**CONFLICTS OF INTEREST:** none to disclose.

# Anatomical homeostasis in a self-regulating Virtual Embryo



**Mouse Morula**

*SOURCE: Science Photo Library*



*SOURCE: Andersen, Newman and Otter  
(2006) Am. Assoc. Artif. Intel.*

# Breathing life into a 'Virtual Embryo'

- CompuCell3D is an open source C++ software environment for solving biocomplexity problems - developed by James Glazier and colleagues at Indiana University.
- Mathematically integrates kinematic (chemical fields) with dynamic (cellular response) for cell-autonomous 'agents' that interact in a shared microenvironment.
- Control systems are transparently encapsulated with Python and dynamically-loaded at runtime to execute steppables for individual cell behaviors and extracellular forces:
  - cell growth, proliferation, adhesion, differentiation, polarization, motility, apoptosis, ...
  - ECM synthesis, reaction-diffusion gradients, clocks, mechanical boundaries, fluid flow, ...
- The simulation self-organizes into phenotypes that reflect emergent properties of the system as a possible solution to specific cellular lesions.

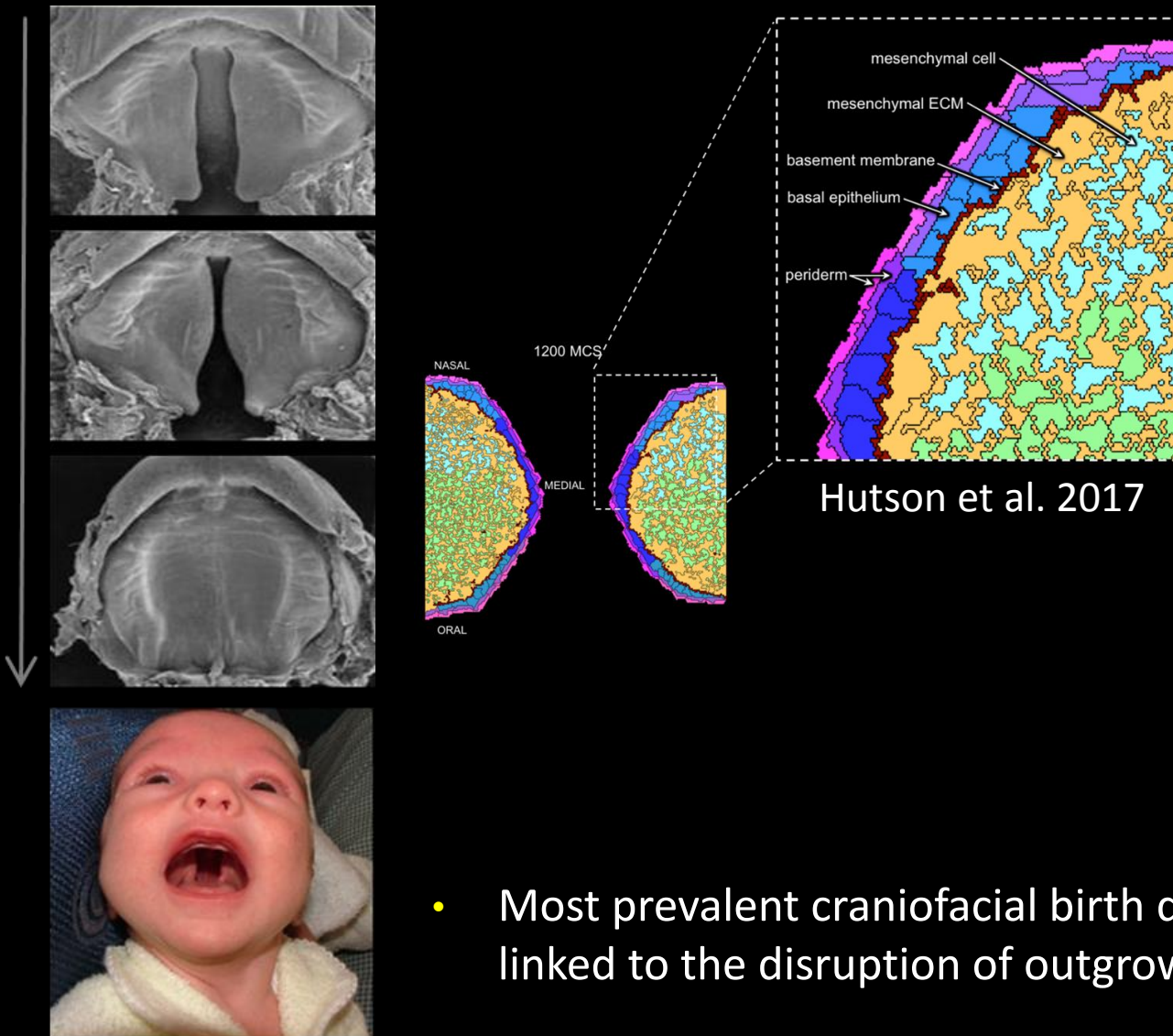
## In a nutshell ...



- Large data streams from ToxCast provide an alternative testing paradigm but require computational models to integrate HTS data with biological understanding.
- We are building and testing **Agent-Based Models** (ABMs) of human development that can be executed *in silico* with the CompuCell3D to:
  - *reconstruct tissue development cell-by-cell and interaction-by-interaction;*
  - *qualitative prediction of virtual phenotypes (cybermorphs);*
  - *impute ToxCast data into a virtual-tissue computer simulation;*
  - *and return quantitative predictions of teratogenicity.*
- These simulations provide a systems-based approach that is 3R's-compliant and amenable to forward-engineer and reverse-engineer developmental toxicity.



# 1. Reconstructing tissue development: *cleft palate as an example*



**Chemical Research in Toxicology** Article  
pubs.acs.org/crt

## Computational Model of Secondary Palate Fusion and Disruption

M. Shane Hutson,<sup>\*,†,‡</sup> Maxwell C. K. Leung,<sup>‡</sup> Nancy C. Baker,<sup>§</sup> Richard M. Spencer,<sup>§</sup> and Thomas B. Knudsen<sup>\*,||</sup>

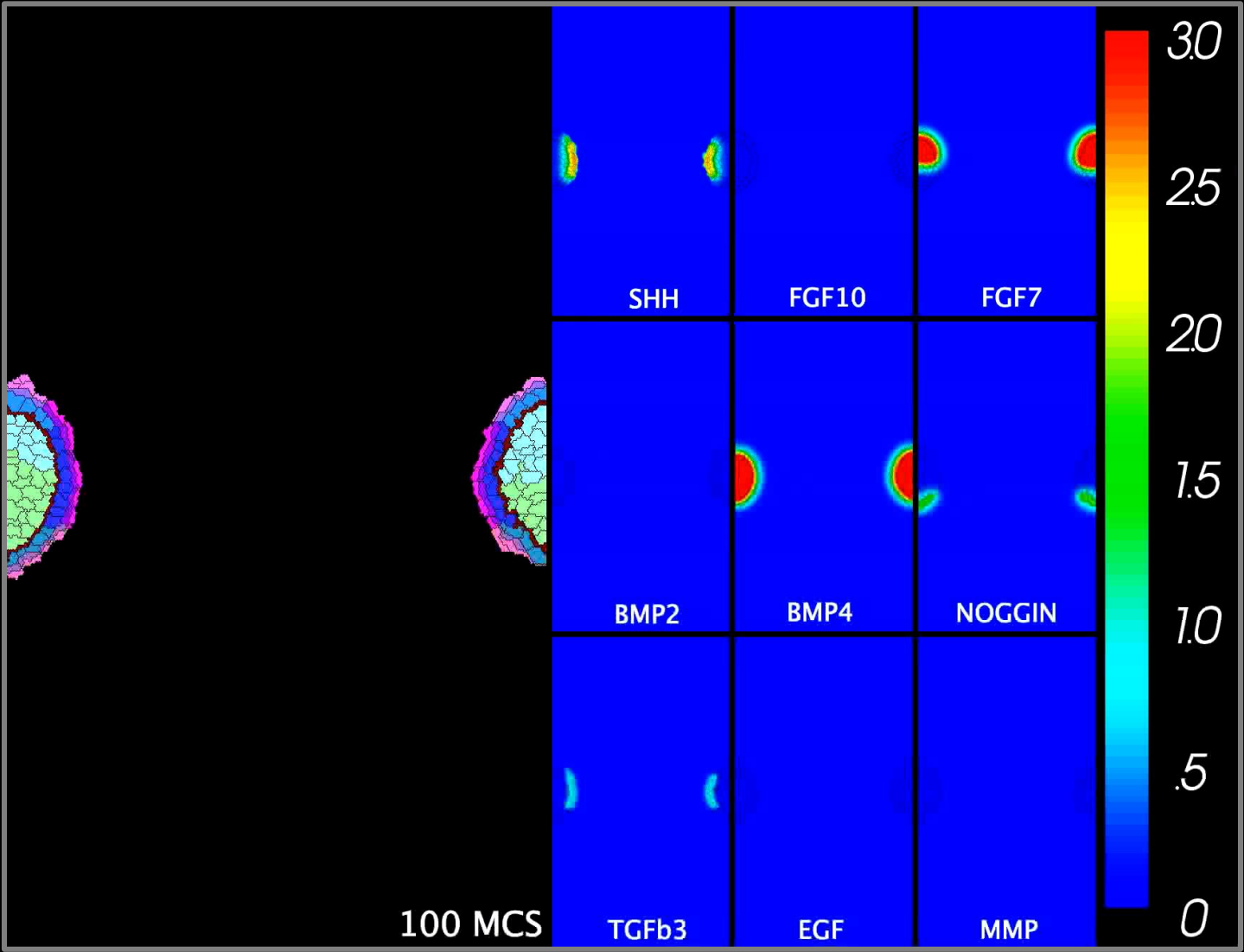
<sup>†</sup>Department of Physics & Astronomy, Department of Biological Sciences and Vanderbilt Institute for Integrative Biosystem Research & Education, Vanderbilt University, Nashville, Tennessee 37235, United States  
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<sup>||</sup>National Center for Computational Toxicology, Office of Research & Development, U.S. Environmental Protection Agency, Research Triangle Park, Durham, North Carolina 27711, United States

**S** Supporting Information

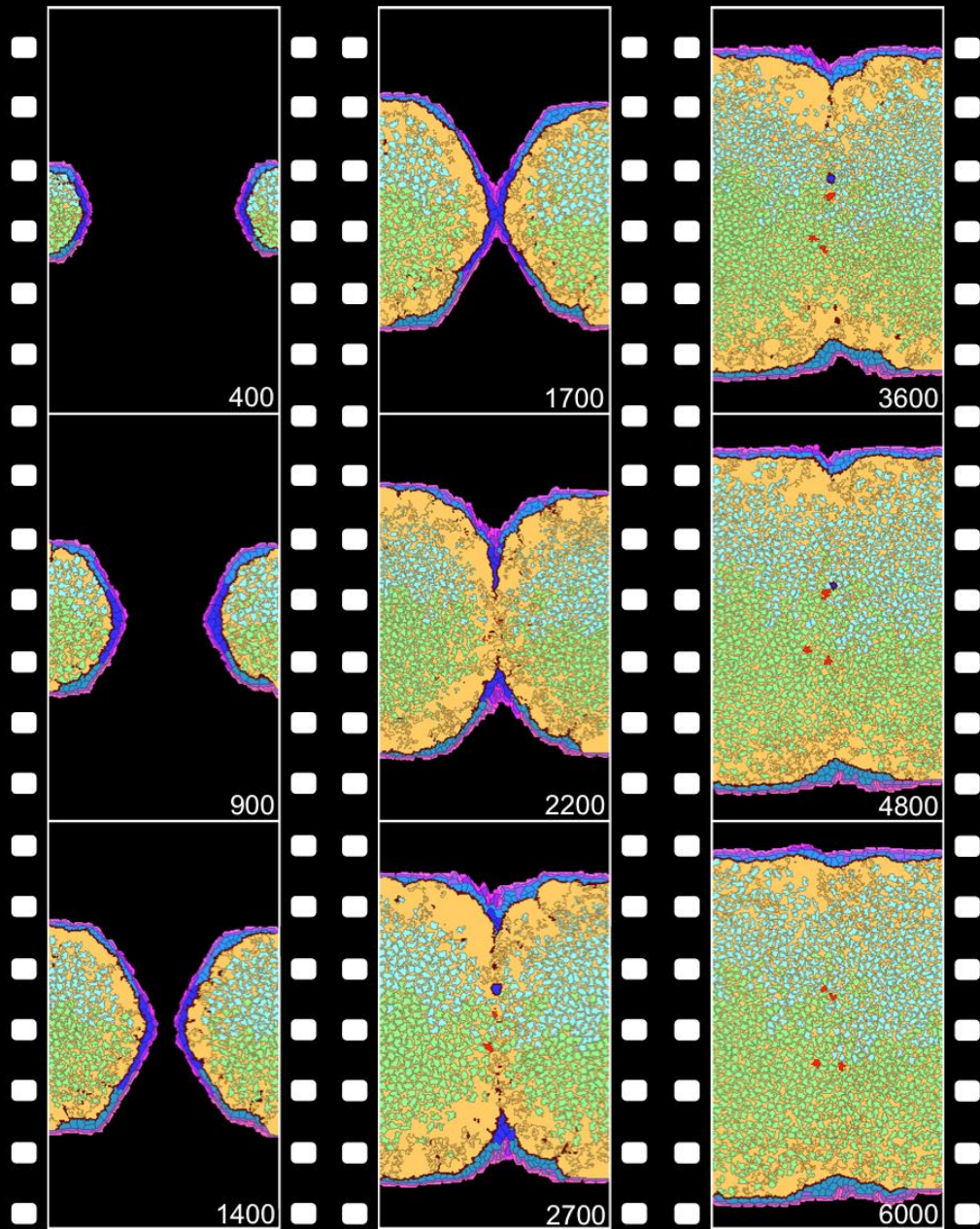
**ABSTRACT:** Morphogenetic events are driven by cell-generated physical forces and complex cellular dynamics. To improve our capacity to predict developmental effects from chemical-induced cellular alterations, we built a multicellular agent-based model in CompuCell3D that recapitulates the cellular networks and collective cell behavior underlying growth and fusion of the mammalian secondary palate. The model incorporated multiple signaling pathways (TGF $\beta$ , BMP, FGF, EGF, and SHH) in a biological framework to recapitulate morphogenetic events from palatal outgrowth through midline fusion. It effectively simulated higher-level phenotypes (e.g., midline contact, medial edge seam (MES) breakdown,

- Most prevalent craniofacial birth defect (annually ~7000 newborns in the USA), linked to the disruption of outgrowth and fusion of the embryonic palatal processes.

# ABM for palatal outgrowth and fusion

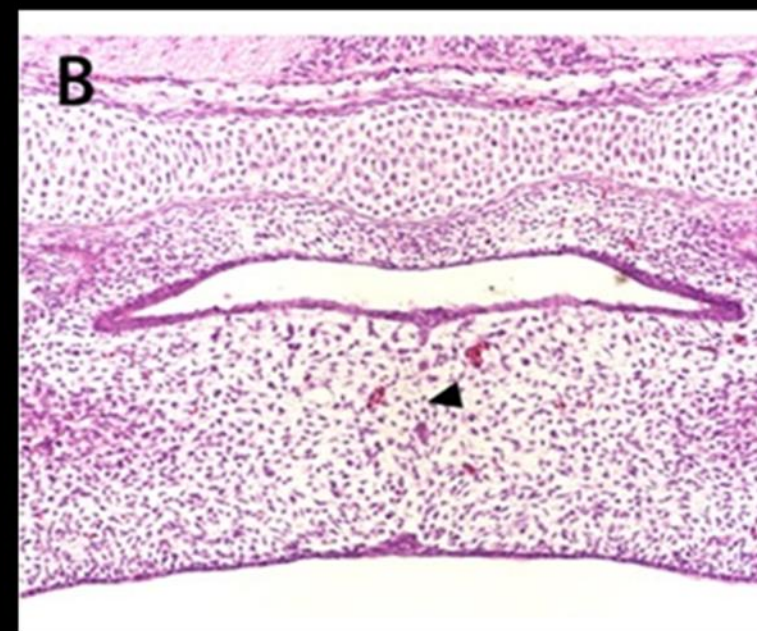
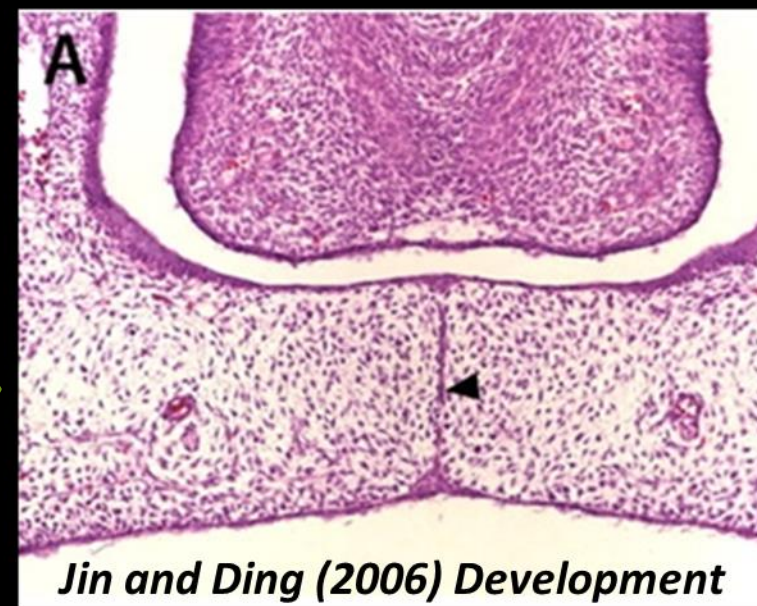






*in silico*

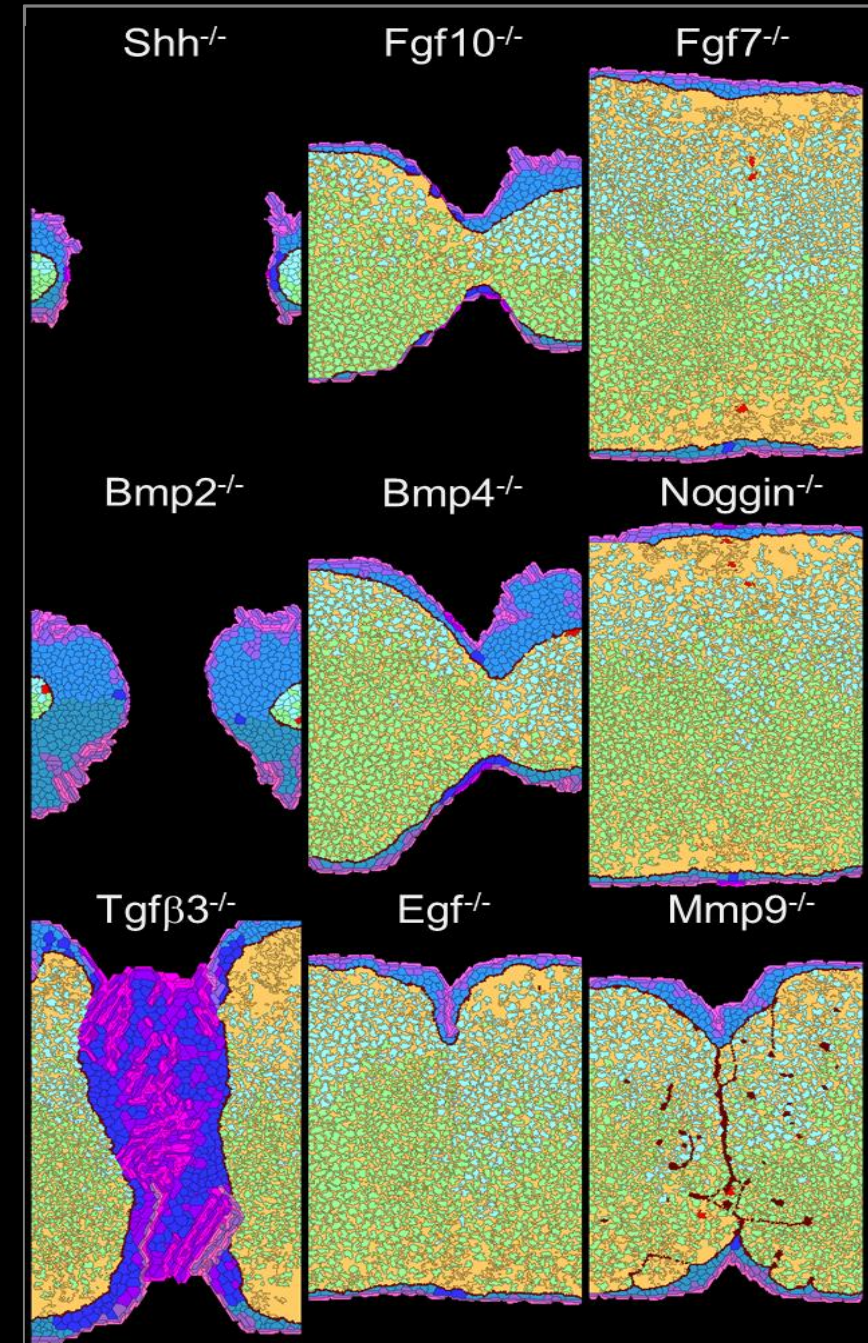
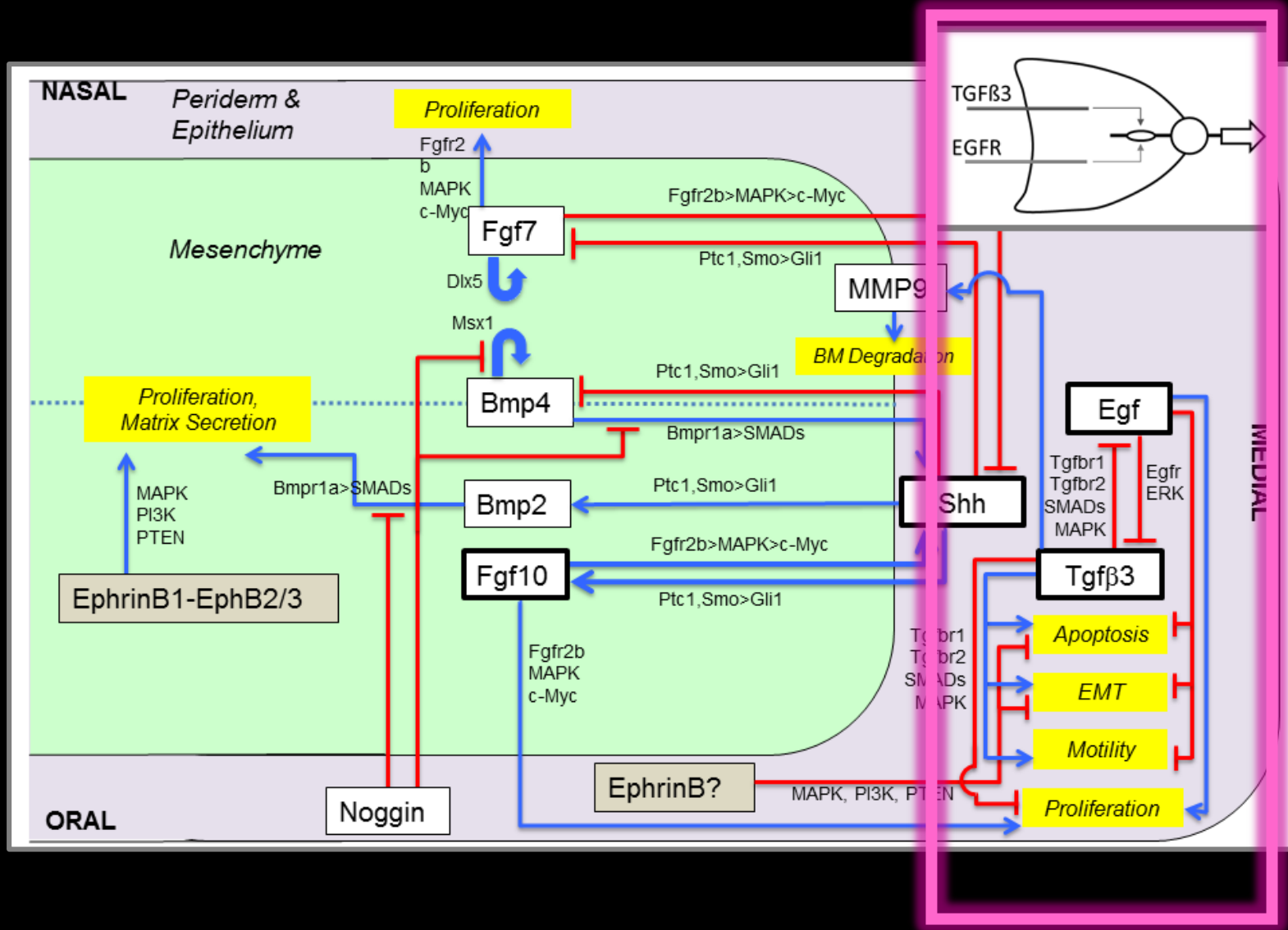
*in vivo*



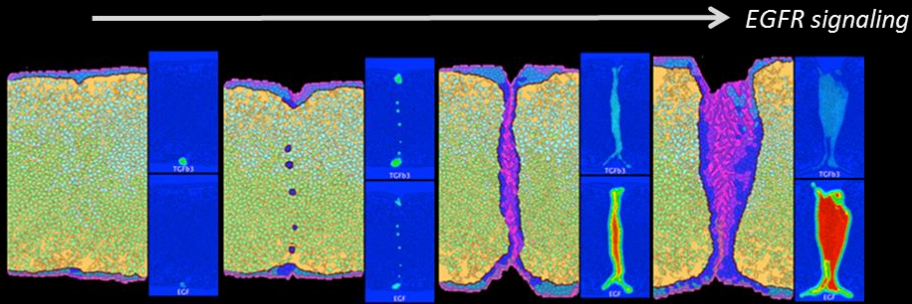


## 2. Qualitative prediction of phenotype

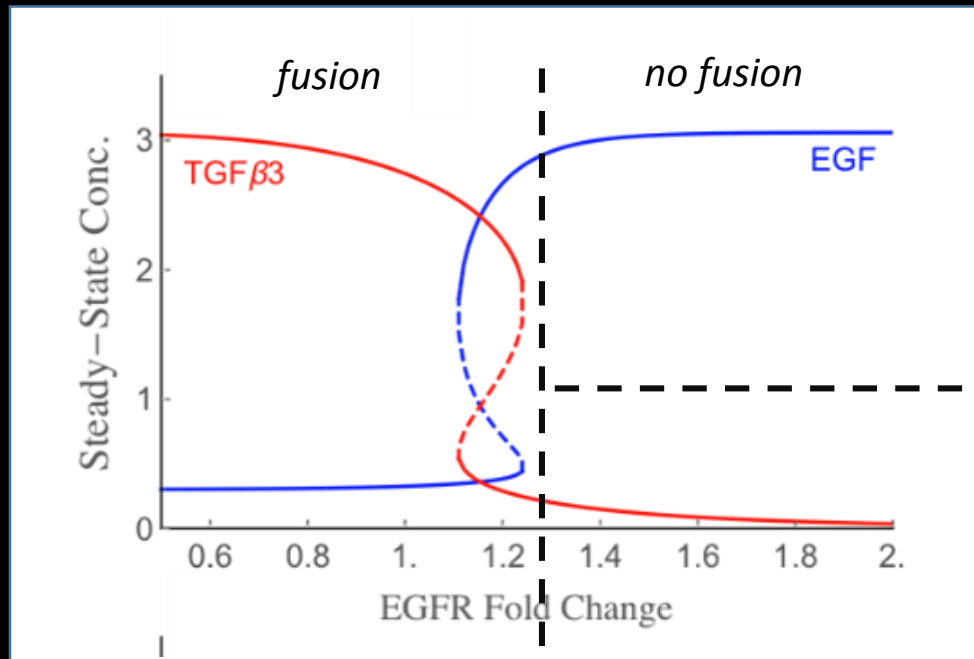
*hacking the control network → 'Cybermorphs'*



### 3. Imputing ToxCast data into the model



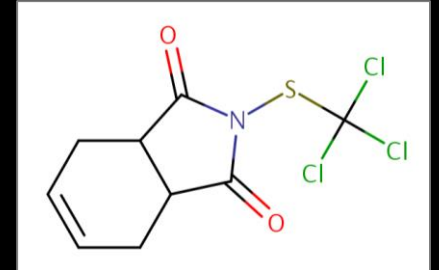
Switch dynamics



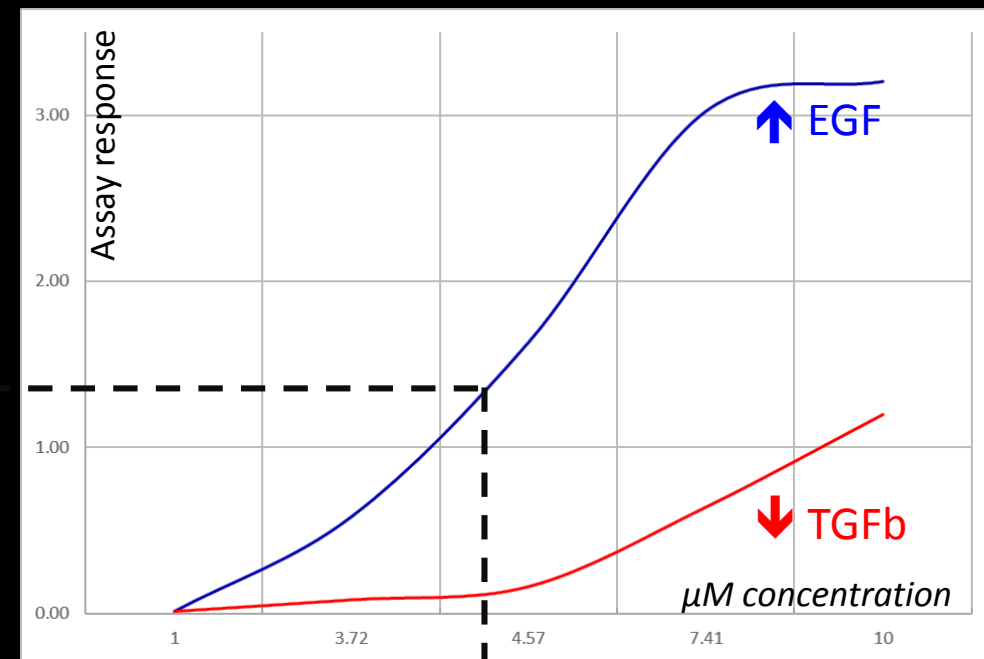
virtual tipping point  $\sim 1.2x$  EGFR

#### Captan

ToxRefDB NOAEL = 10 mg/kg/day  
(rabbit) LOAEL = 30 mg/kg/day

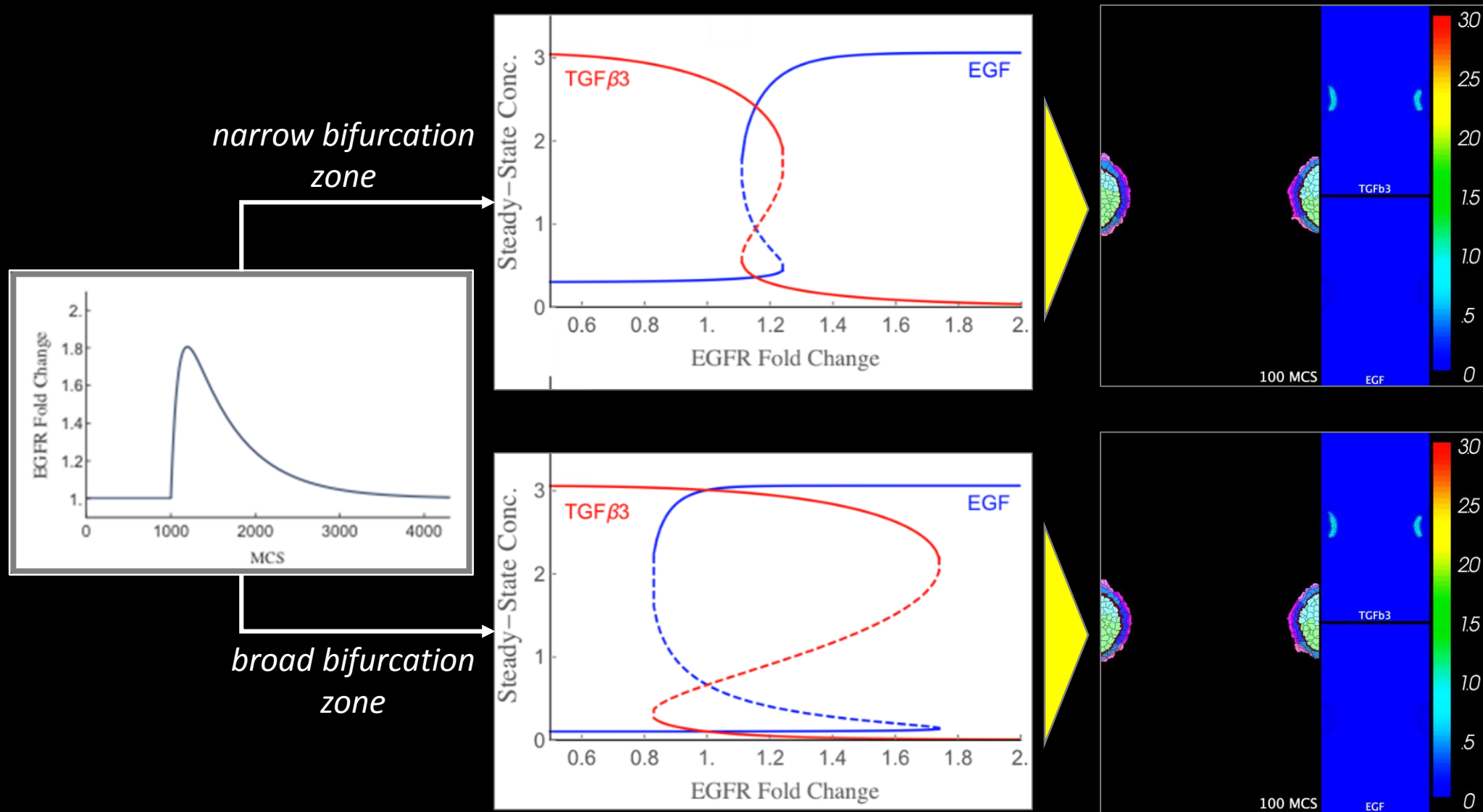


ToxCast dose response



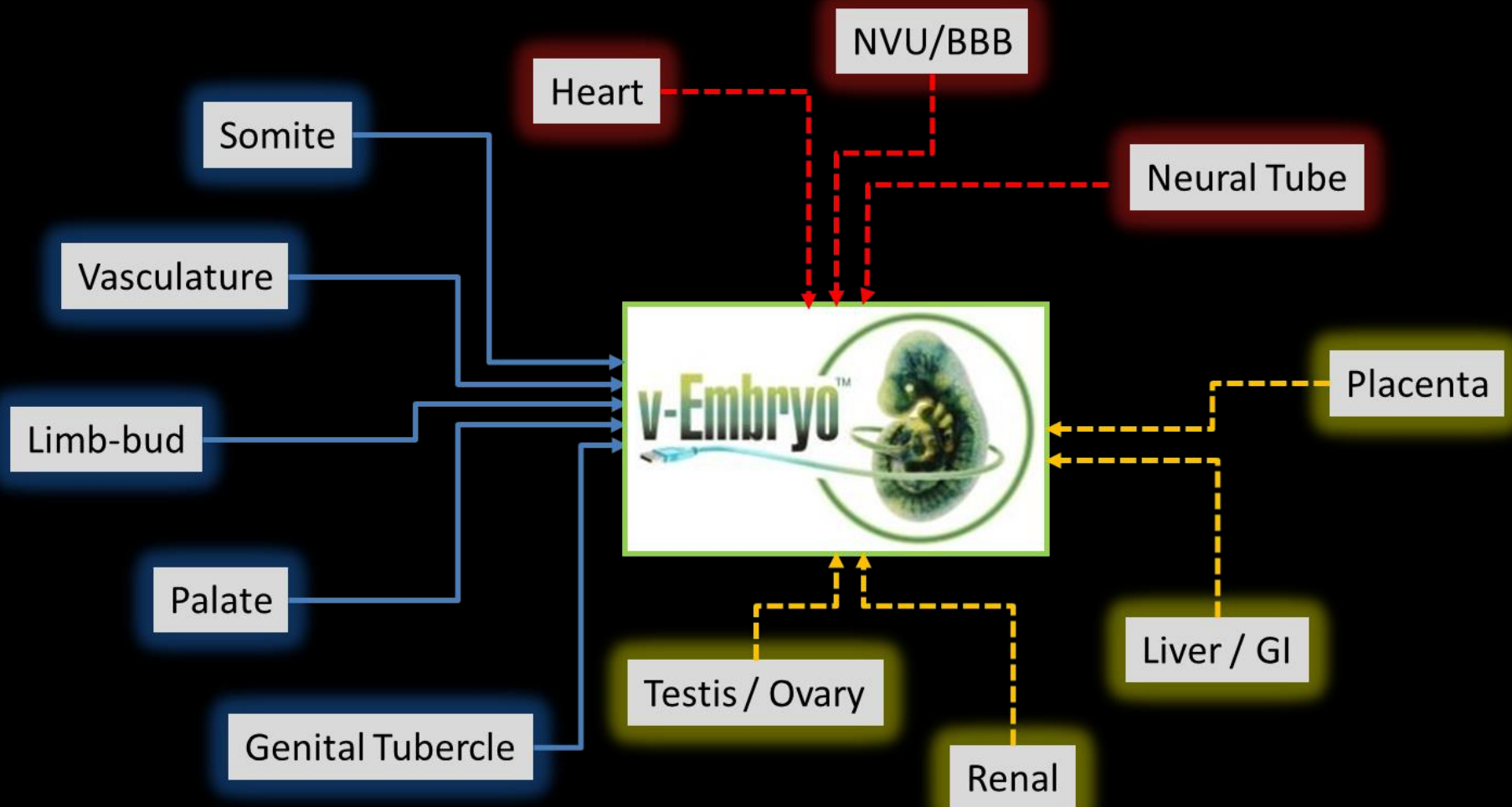
tipping point  $\sim 4 \mu\text{M}$  Captan

## 4. Quantitative prediction of teratogenicity: *messin'* with the switch





**Grand Challenge:** *a predictive virtual embryo - how far must 'computational embryology' advance to predict developmental toxicity in lieu of animal testing?*



# Special Thanks

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Sid Hunter – EPA/NHEERL

# Barbara Abbott – EPA/NHEERL

# David Belair – EPA/NHEERL

# Shane Hutson – Vanderbilt U / STAR

James Glazier – Indiana U / STAR

The logo for EPA Science in Action. It features the EPA logo on the left, followed by the text "science in ACTION" in a large, white, sans-serif font. Below this, in a smaller white font, is the tagline "INNOVATIVE RESEARCH FOR A SUSTAINABLE FUTURE". The entire logo is set against a dark blue background.

Virtual Tissue Models: Predicting How Chemicals Impact Human Development



[http://www2.epa.gov/sites/production/files/2015-08/documents/virtual\\_tissue\\_models\\_fact\\_sheet\\_final.pdf](http://www2.epa.gov/sites/production/files/2015-08/documents/virtual_tissue_models_fact_sheet_final.pdf)

**SOT Contemporary Concepts in Toxicology Conference**



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