

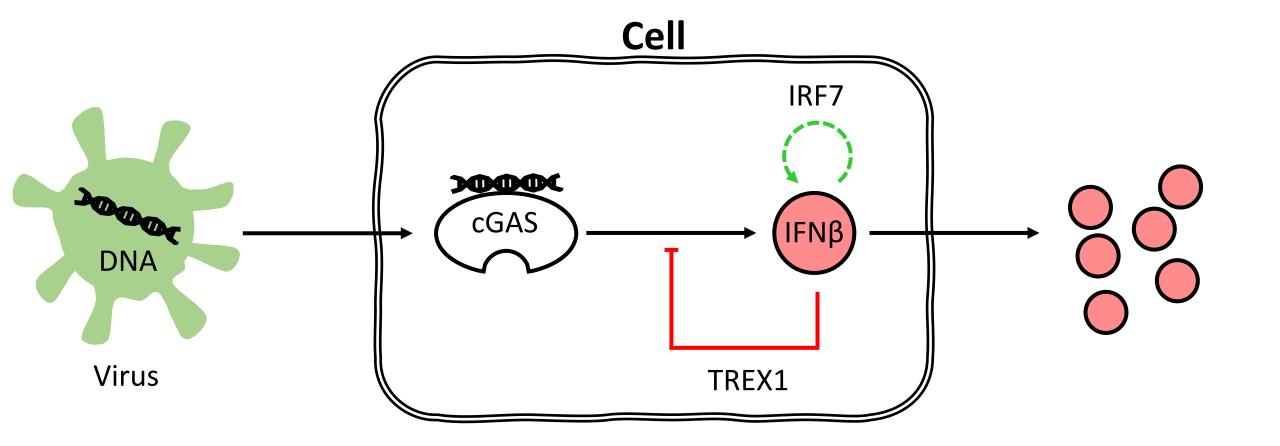
# Quantifying the Impact of Cellular Heterogeneity on cGAS Pathway Regulation using Multiscale Agent-Based Modeling

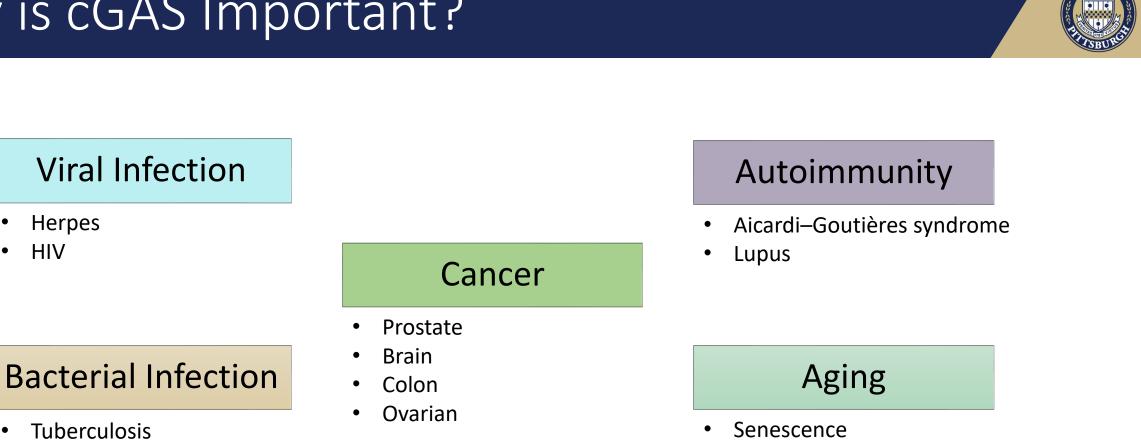
<u>Robert W. Gregg<sup>1</sup></u> Jason E. Shoemaker <sup>1,2,3</sup>

<sup>1</sup>Department of Chemical Engineering, <sup>2</sup>McGowan Institute for Regenerative Medicine, <sup>3</sup>Department of Computational and Systems Biology, University of Pittsburgh, Pittsburgh, PA

Tuesday, November 12, 2019

## Cells Produce Interferon in Response to DNA





Listeria

HIV

- DNA Damage •
- To better understand this immune response, we need to develop models that can capture cellular behavior

Motwani et. al. "DNA sensing by the cGAS–STING pathway in health and disease." *Nature Reviews* (2019)

## Using an ODE Model Approach



Contents lists available at ScienceDirect

#### Journal of Theoretical Biology

journal homepage: www.elsevier.com/locate/jtb

# Mathematical modeling of the cGAS pathway reveals robustness of DNA sensing to TREX1 feedback

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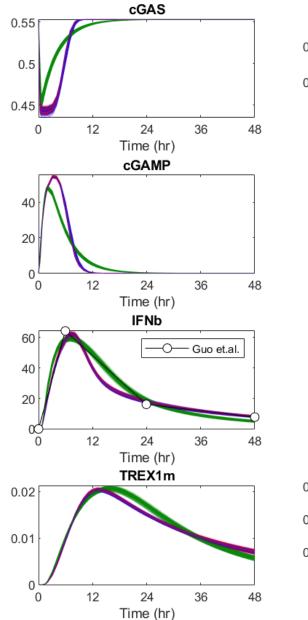


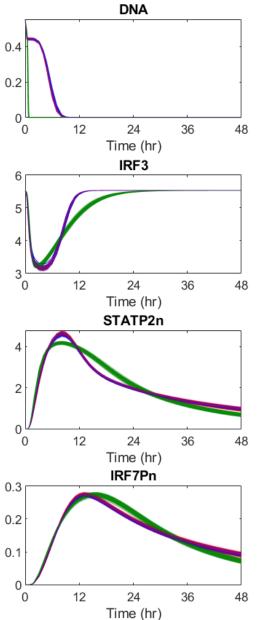
Journal of Theoretical Biology

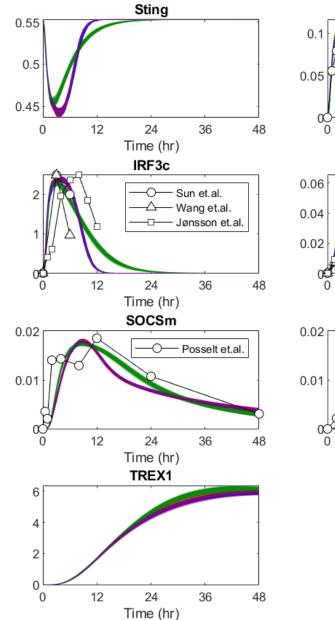


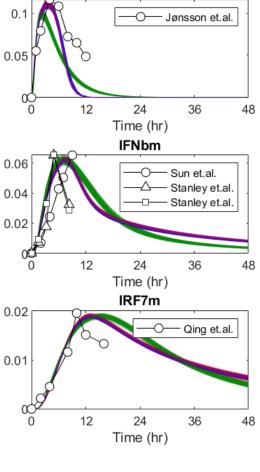
### Using an ODE Model Approach







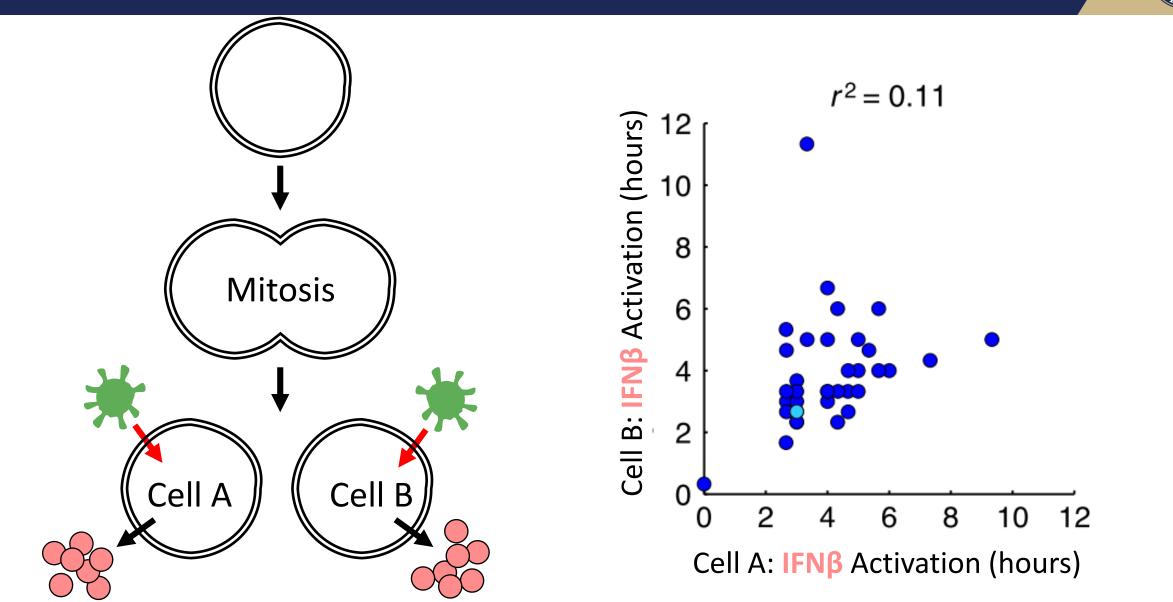




STINGc



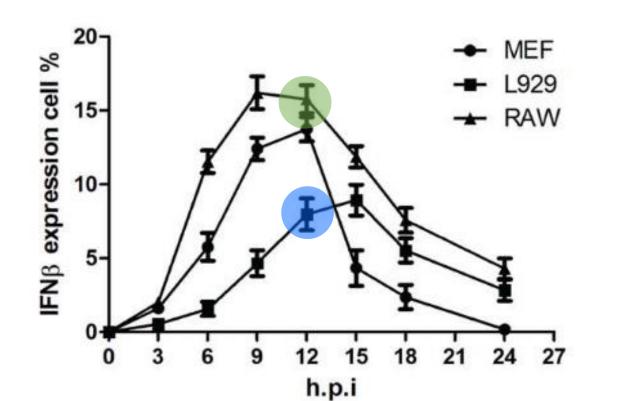
## Interferon Producing Cells are Heterogeneous



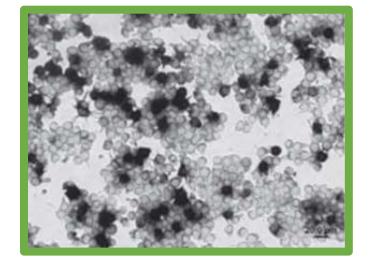
Rand U et al. Multi-layered stochasticity and paracrine signal propagation shape the type-I interferon response. Mol Syst Bio (2012).

## Interferon Signaling is Stochastic

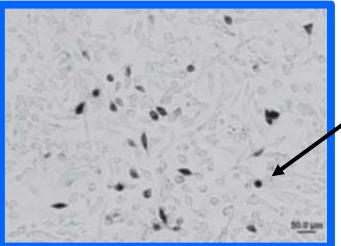




**RAW Cells** 



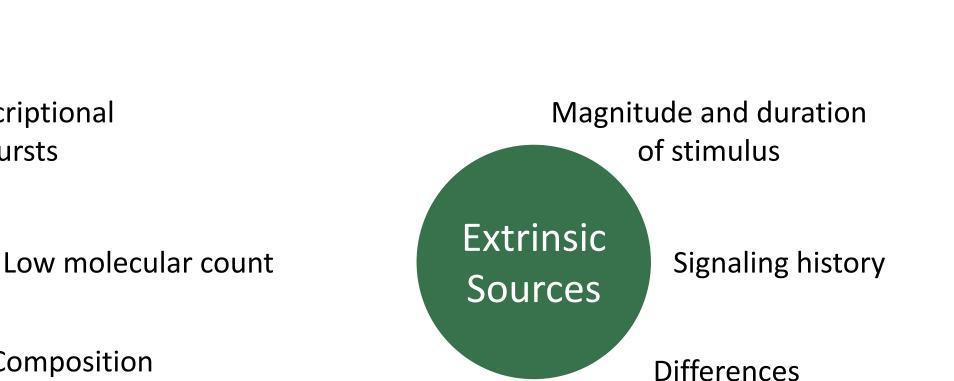
L929 Cells



Dark spots indicate IFNβ mRNA

Zhao et al. "Stochastic expression of the interferon- $\beta$  gene." PLoS biology (2012).

### Sources of Heterogeneity and Stochasticity



Composition after cellular division

Transcriptional

bursts

Intrinsic

Sources

in local environment



- $\bullet$  We know IFN  $\beta$  signaling is heterogenous and stochastic
- We want to know what benefit this brings to a cell population
  - Conserve resources?
  - Prevent pathogens from circumventing immune signaling?

We hypothesize there exists an optimal level of cell to cell variability that balances pathogenic clearance and chronic IFNB signaling



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Build on previous work (ODEs)

#### Model large systems (>10,000 cells)

Be able to model spatiotemporal events

Incorporate stochastic and heterogeneous behavior

ODE Modeling

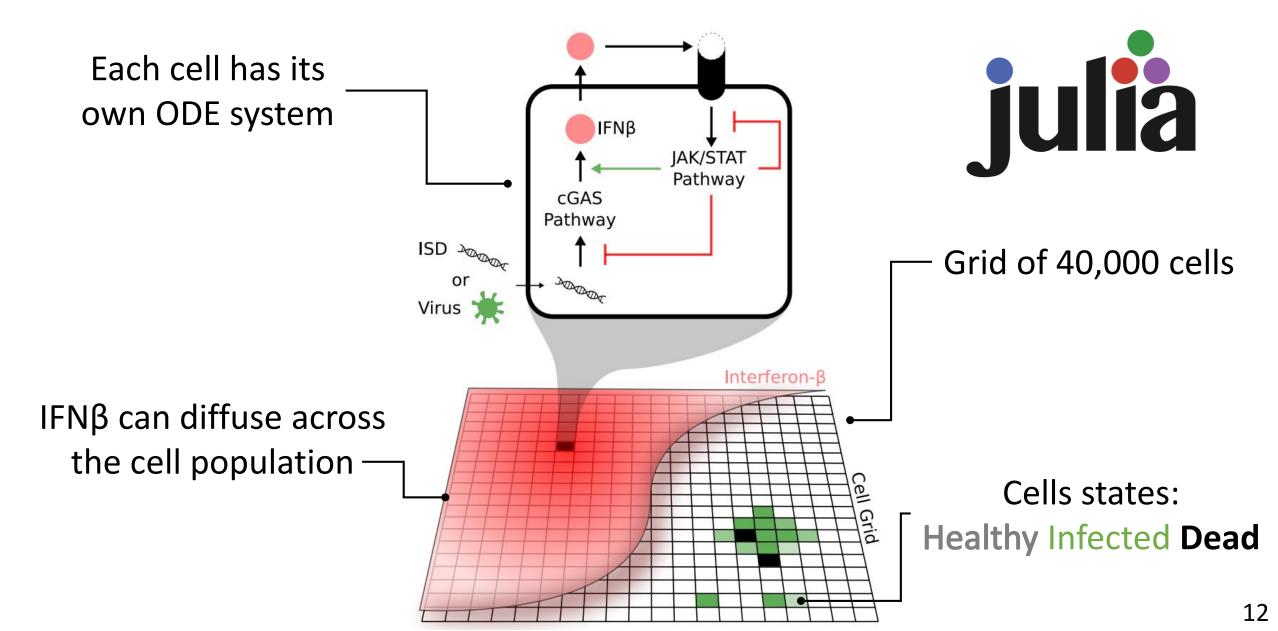
PDE Modeling

ABM Modeling

Hybrid PDE/ABM Modeling with ODE Rule Sets

## Defining the Model

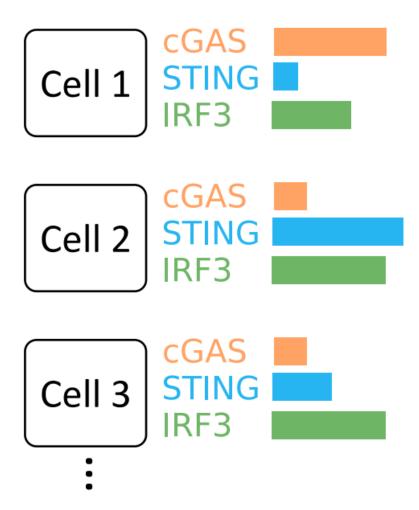


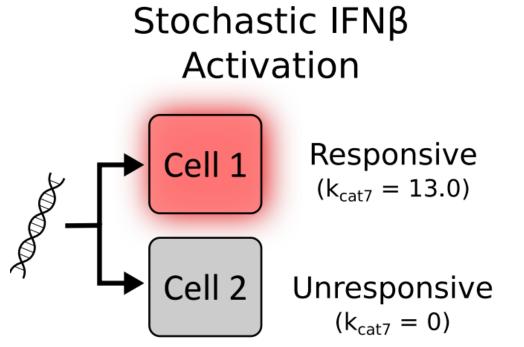


## Incorporating Heterogeneity and Stochasticity

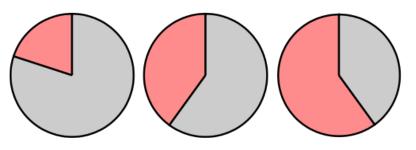


Heterogeneous Initial Conditions





Vary Percentage of IFNβ Responding Cells

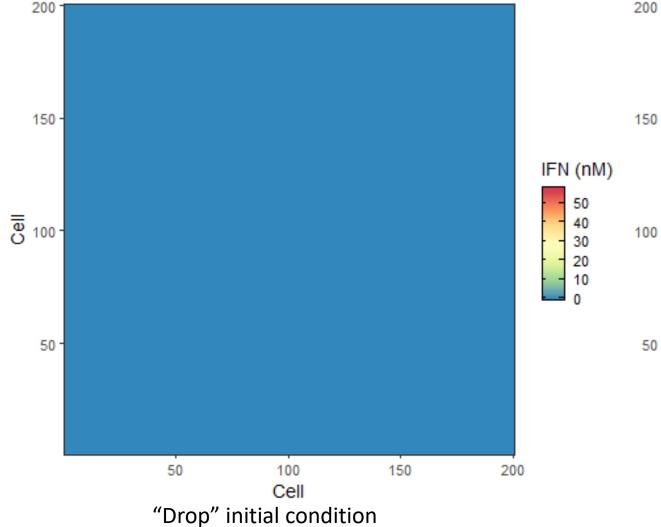


## Simulating IFNβ Transport

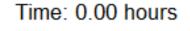


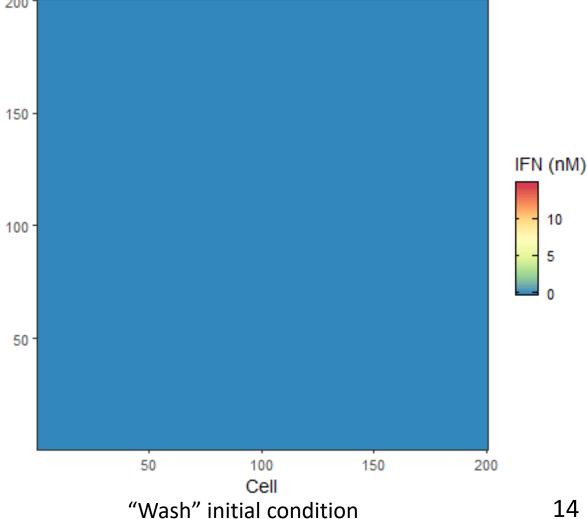
### **ISD** Infection





#### **Viral Infection**





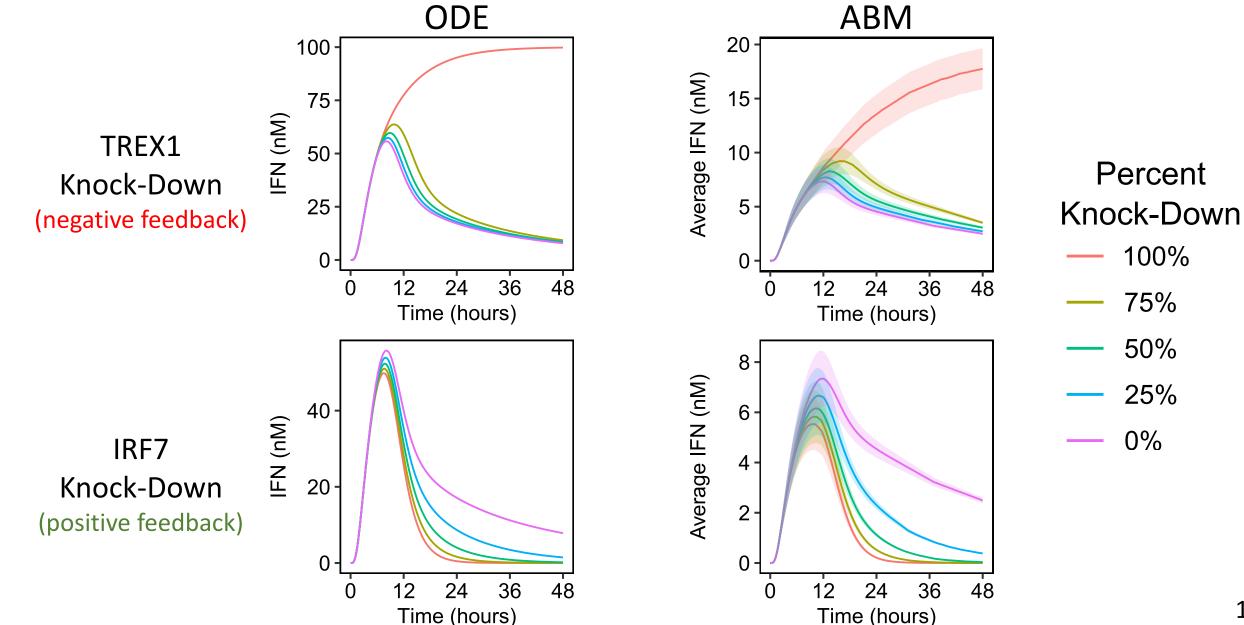
10

5

0

#### Heterogeneity does not Impact Bulk Cell Measurements

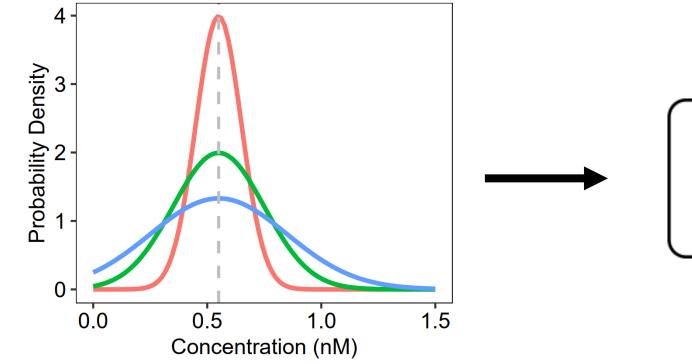




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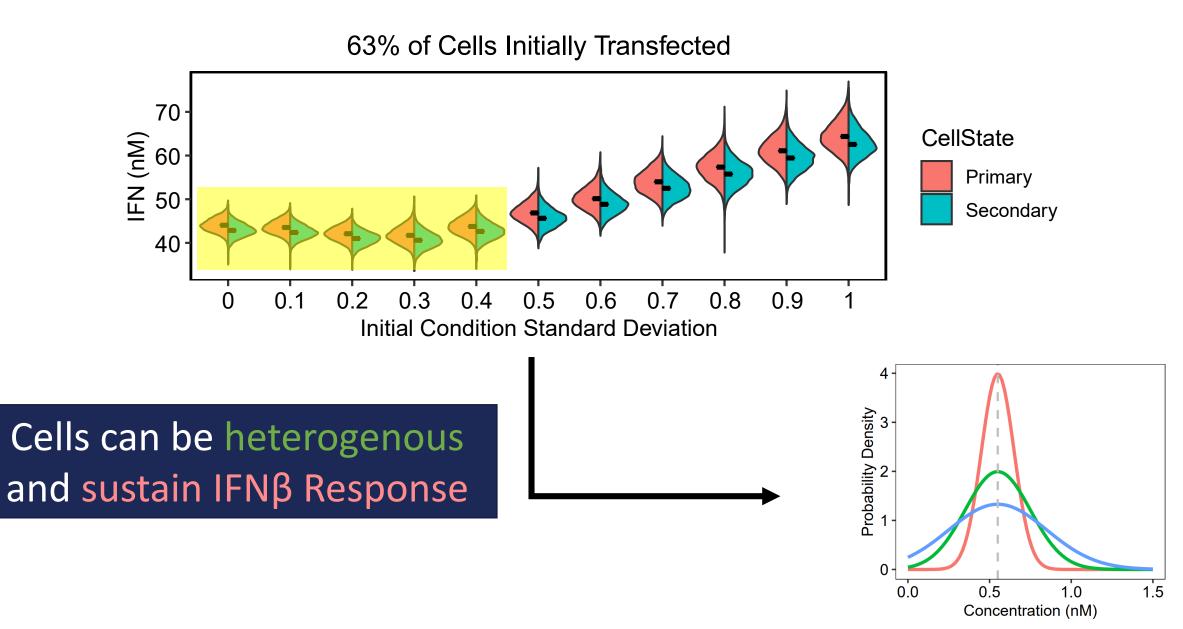
Adding Gaussian noise to initial conditions



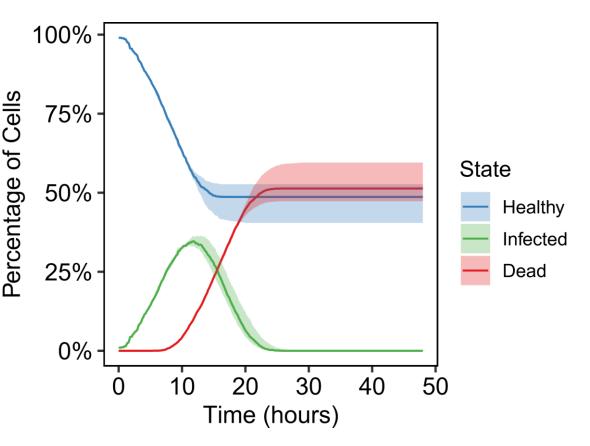


#### Heterogeneity in Cell Composition Increases IFNB Production





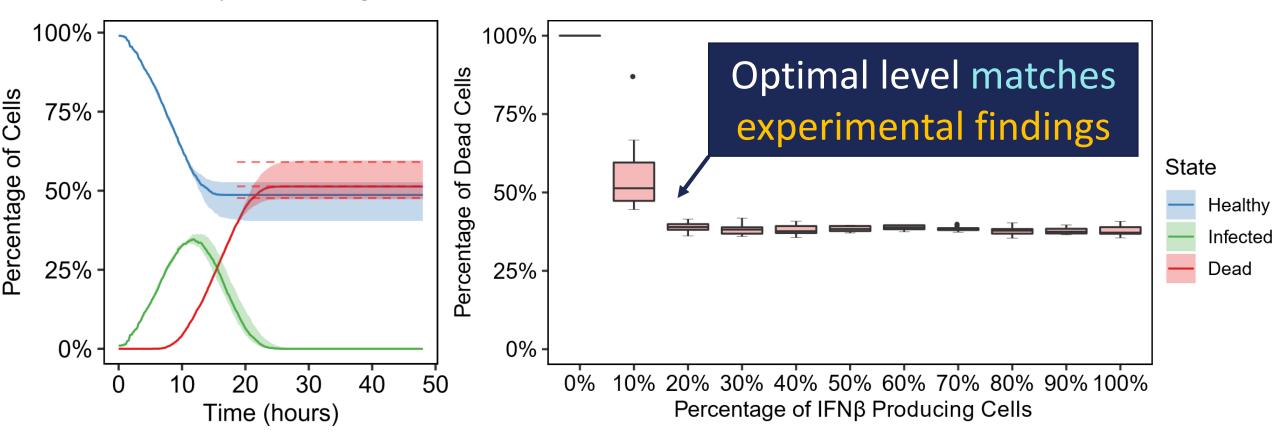
### There is an Optimal Level of IFN<sub>β</sub> Producing Cells



VERSIT



#### 10% IFNβ Producing Cells



### Conclusions





Modern compiled languages like Julia allow for large simulations



Adding **heterogeneity** into the model had **no impact on bulk measurements** 



**Heterogeneity** allows cells to maintain low molecular concentrations without sacrificing interferon production



**Stochasticity** allows cells to produce minimum interferon while maintaining cell survival

## Acknowledgements

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- Arundhati Ghosh, Ph.D

University of Pittsburgh

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