

# A Bayesian framework to model transmissible cancer dynamics within soft-shell clam (*Mya arenaria*) populations



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## Background

### Bivalve Transmissible Neoplasia (BTN)

- Transmissible cancer occurs in a few species, including Tasmanian devils, dogs, and several bivalve species.
- In soft-shell clams, a leukemia-like cancer was confirmed to be transmissible in 2015 and is spread through waterborne cancer cells<sup>1</sup>
- Infected clams release cells that can survive for weeks, especially in cold temperatures, leading to seasonality in disease prevalence<sup>2</sup>



Soft-shell Clam

### Marine Disease Modeling

- Most disease models are built for terrestrial systems, but marine diseases follow different dynamics
- Environmental factors like temperature influence pathogen survival and transmission, shaping seasonal disease dynamics

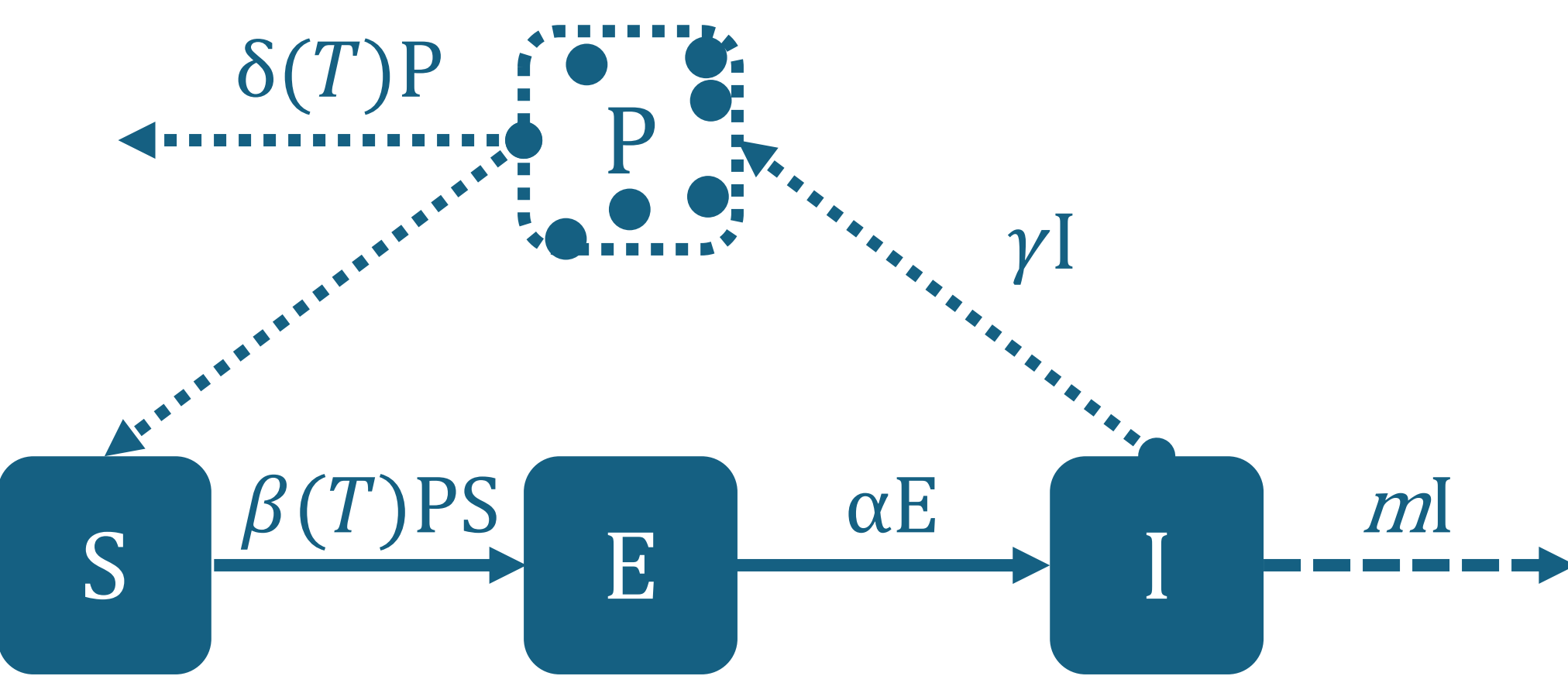
### Bayesian Approaches in Disease Modeling

- Bayesian methods combine lab data and field observations.
- We use Stan<sup>3</sup>, a probabilistic programming language, to:
  - Efficiently fit ordinary differential equation-based models
  - Estimate key transmission and progression parameters
  - Quantify uncertainty in predictions

## Key Objectives

- Develop a temperature-dependent SEIP model for environmental cancer transmission in soft-shell clams
- Estimate transmission, progression, and particle emission rates using Bayesian inference
- Test the hypothesis that incorporating seasonal temperature effects allows the model to reproduce observed trends in disease dynamics

## SEIP Model Structure

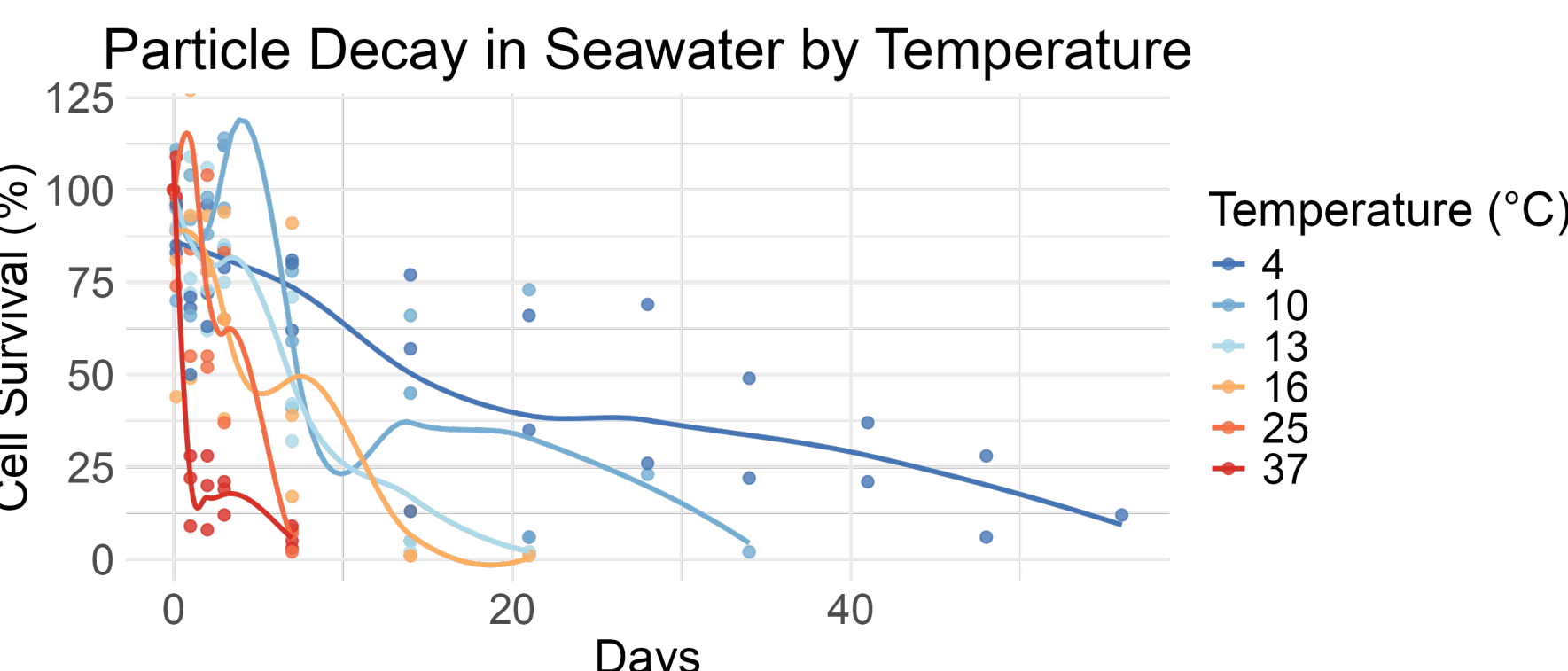


Adapted from a marine infectious disease model<sup>4</sup>:

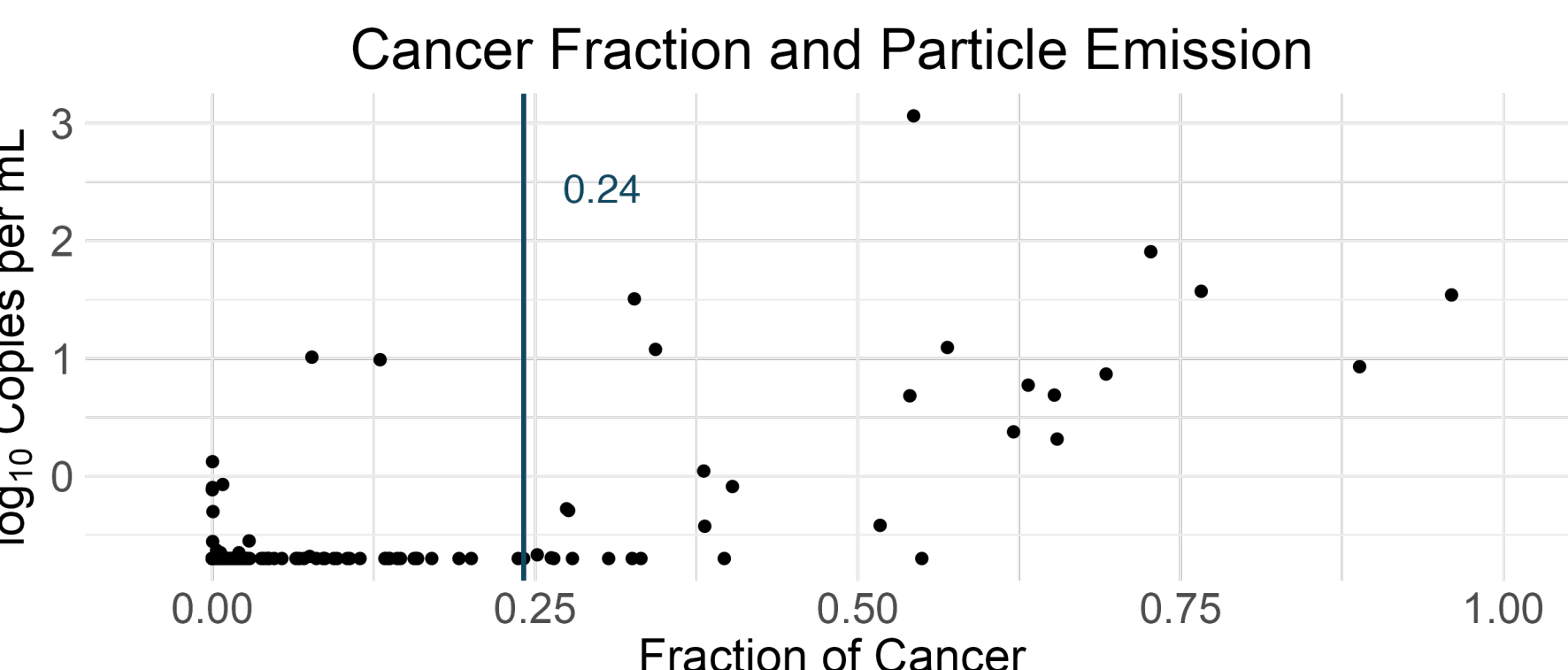
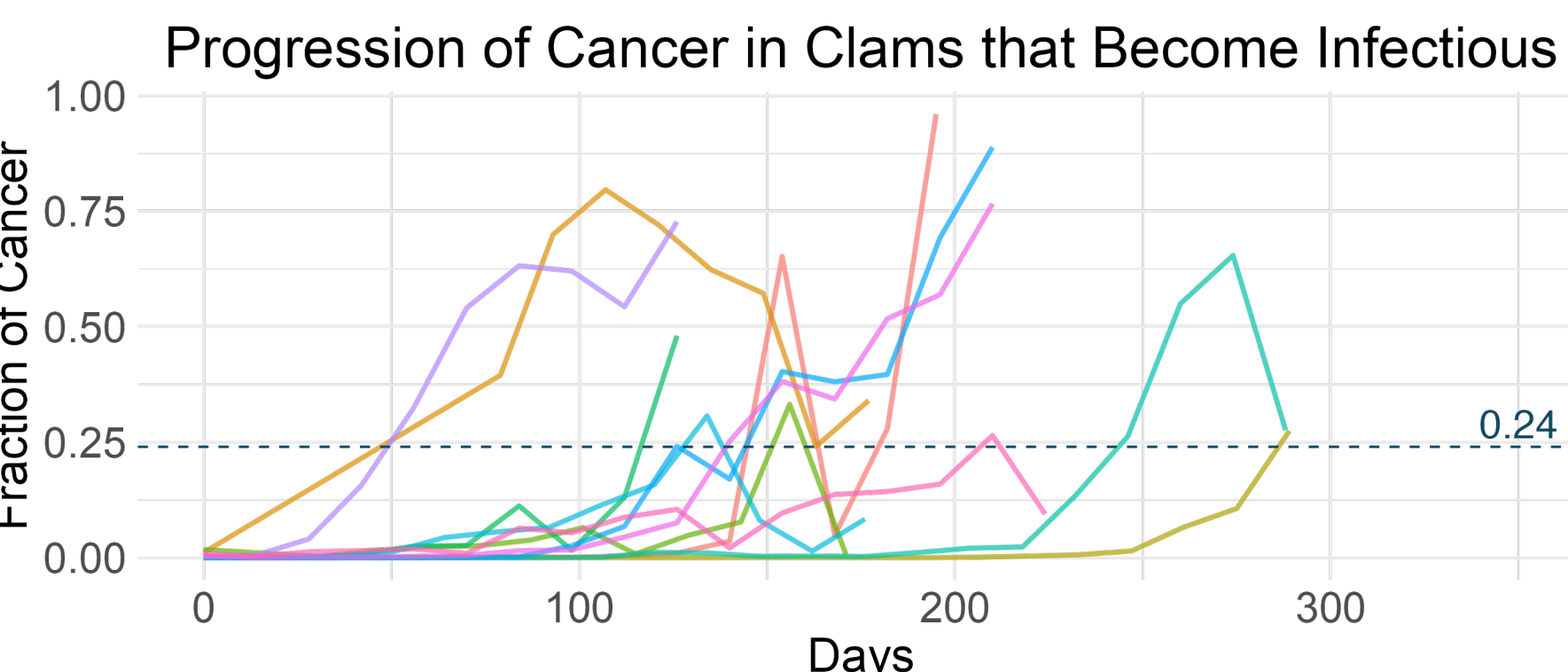
- Susceptible clams (S) become exposed (E) via contact with cancer cells in the water
- Transmission rate ( $\beta$ ) varies with temperature
- Infected clams (I) release cancer cells (particles, P) into the environment
- Particle decay rate ( $\delta$ ) is also temperature-dependent

## Parameter Priors and Survey Data

### Laboratory Data Used to Inform Model Parameters



Plot A: Cancer cell decay at different temperatures informs the parameter  $\delta$  and its temperature dependence.



Plot C: Longitudinal data from clams reaching 0.24 cancer fraction. Time to 0.24 informs  $\alpha$ ; time from 0.24 to death informs  $m$ .

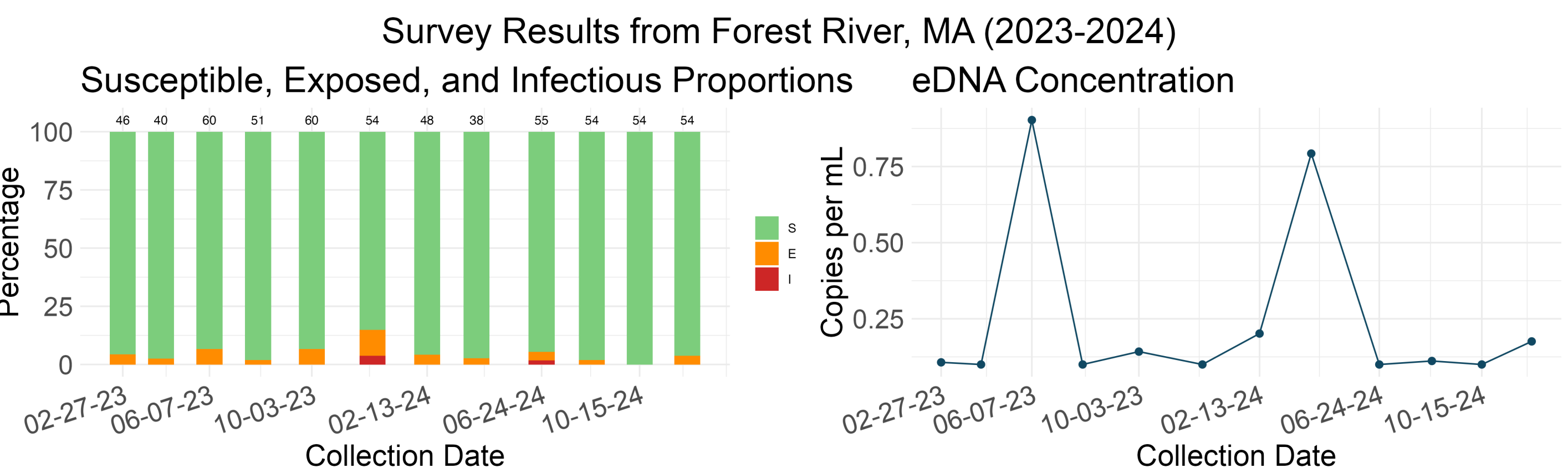
Plot B: Cancer fraction vs. particle release per clam. A changepoint indicates infectiousness; later emissions inform  $\gamma$ .

Parameter	Description	Data/Plot	Prior Mean
$\beta^*$	Progression rate (S $\rightarrow$ E)	-	$\sim 0.02 \text{ day}^{-1}$
$\alpha$	Progression rate (E $\rightarrow$ I)	C	$\sim 0.01 \text{ day}^{-1}$
$m$	Mortality rate (I $\rightarrow$ death)	C	$\sim 0.03 \text{ day}^{-1}$
$\gamma$	Particle emission rate	B	$\sim 11.90 \text{ copies/mL/day}$
$\delta$	Particle decay rate in seawater	A	$\sim (0.12 - 0.16) \text{ day}^{-1}$

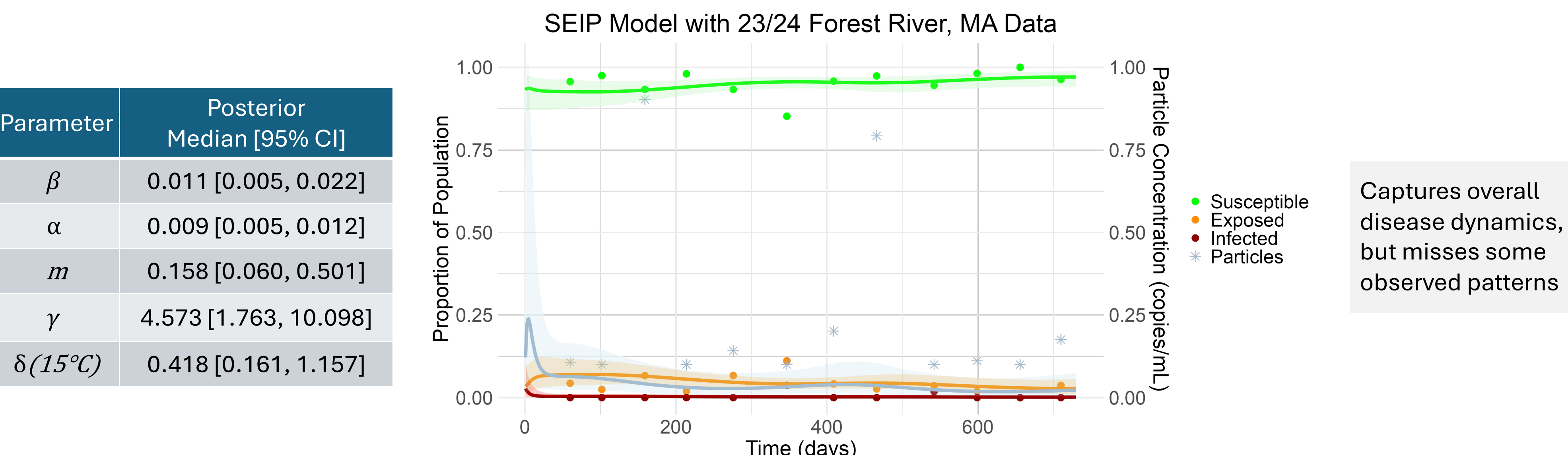
\* Estimated by the model; partially informed by lab-based temperature progression (not shown)

### Observational Data

- Field surveys conducted bi-monthly along the East Coast
- Approximately 50 clams were per time point.
- eDNA from seawater enables quantification of cancer cell concentration

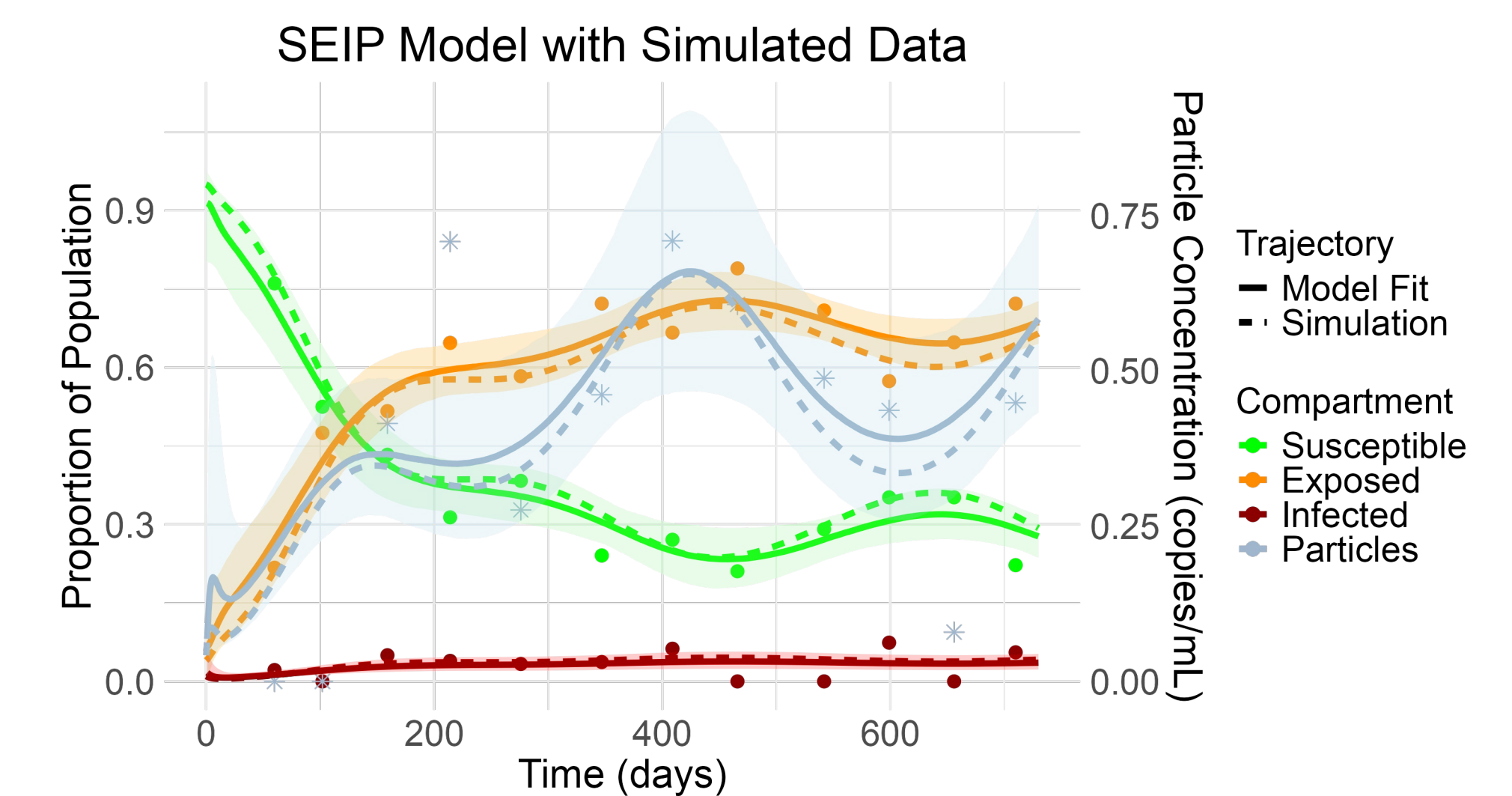


## Preliminary ODE Model Fit to Survey Data



## Discussion

- Discrepancies between the model and field data may be due to:
- Observation error or overdispersion in eDNA data due to detection limits
  - Biological processes not included in the model (e.g., spawning)
  - Insufficient seasonality enforced in the model



## Future Work

- Compare model outputs and assess sensitivity to identify key transmission parameters
- Generate predictions for 2025 and validate against future survey data
- Apply to additional sites to identify differences in transmission across populations



## Acknowledgments

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