

Distributed delay constructively impacts the dynamics of genetic regulatory networks

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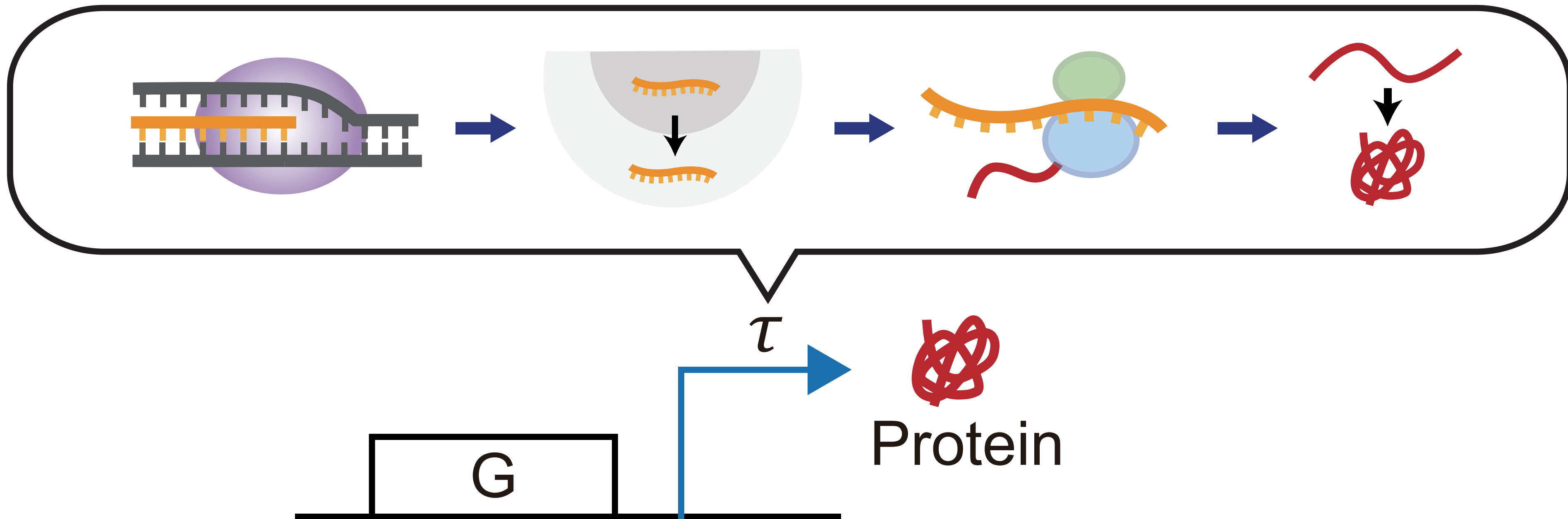
Workshop: Uncertainty Quantification for Mathematical Biology

May 7, 2025

Part 1: Setting

How does distributed delay impact the dynamics of genetic regulatory networks?

Origins of distributed delay



The modeling hierarchy

small system sizes: delay stochastic simulation algorithm (dSSA),
stochastic process of Schlicht and Winkler

moderate system sizes: delay chemical Langevin equation (dCLE)

system size $\rightarrow \infty$: delay reaction rate equation (dRRE)

[Gupta et alii, Modeling delay in genetic networks: From delay birth-death processes to delay stochastic differential equations, J. Chem. Phys., 2014]

Part 2: Delayed negative feedback

How does distributed delay impact biochemical oscillators?

[Song et al, Noisy delay denoises biochemical oscillators, PRL, 2024]

Mather oscillator

$$\dot{r} = \alpha \frac{C_0^2}{[C_0 + r(t)]^2} - \frac{\gamma r(t)}{R_0 + r(t)} - \beta r(t) \quad \leftarrow \quad \text{No delay, does not oscillate}$$

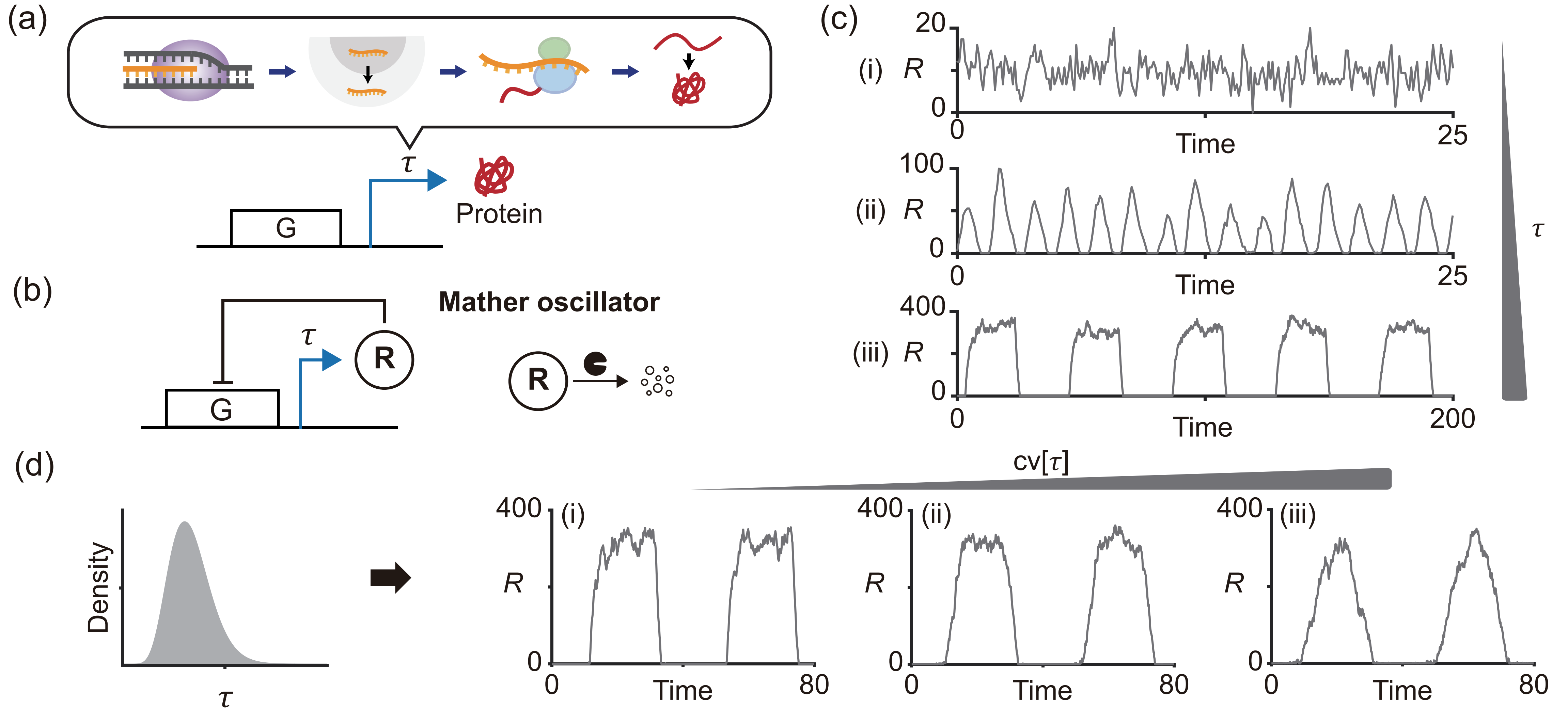
$$\dot{r} = \alpha \frac{C_0^2}{[C_0 + r(t - \tau)]^2} - \frac{\gamma r(t)}{R_0 + r(t)} - \beta r(t) \quad \leftarrow \quad \text{Degrade and fire oscillations}$$

fixed delay

What does distributed delay induce?

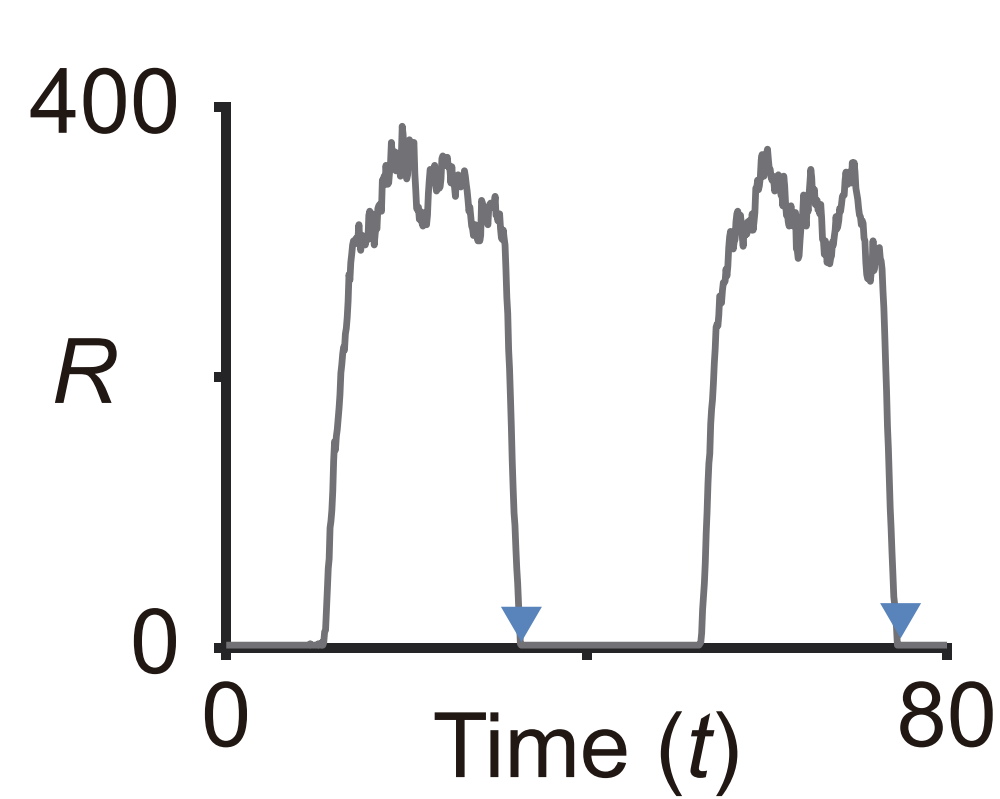
$$\dot{r} = \alpha \left[\int_0^\infty \frac{C_0^2}{[C_0 + r(t - \tau)]^2} d\mu(\tau) \right] - \frac{\gamma r(t)}{R_0 + r(t)} - \beta r(t)$$

Philosophy: Fix delay mean, tune delay CV



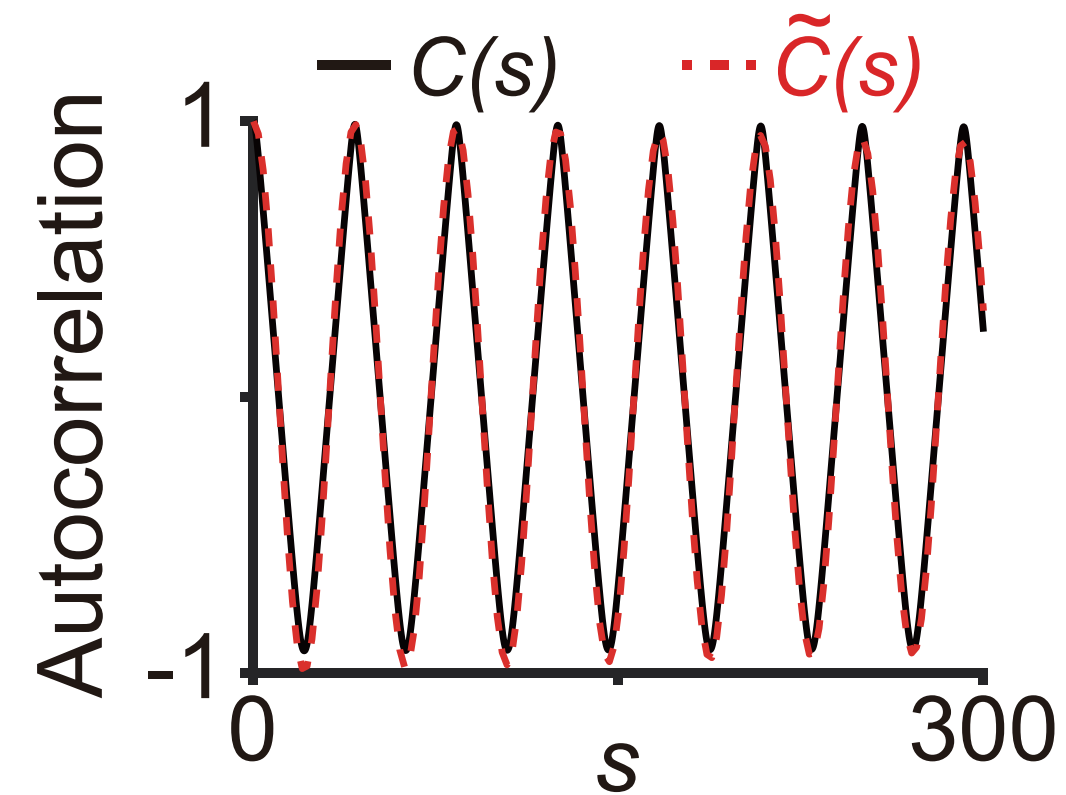
Quantifying the stochastic oscillation

(a)



$$C(s) = \frac{\int (R(t) - \bar{R})(R(t+s) - \bar{R}) dt}{\int (R(t) - \bar{R})^2 dt}$$

(i)

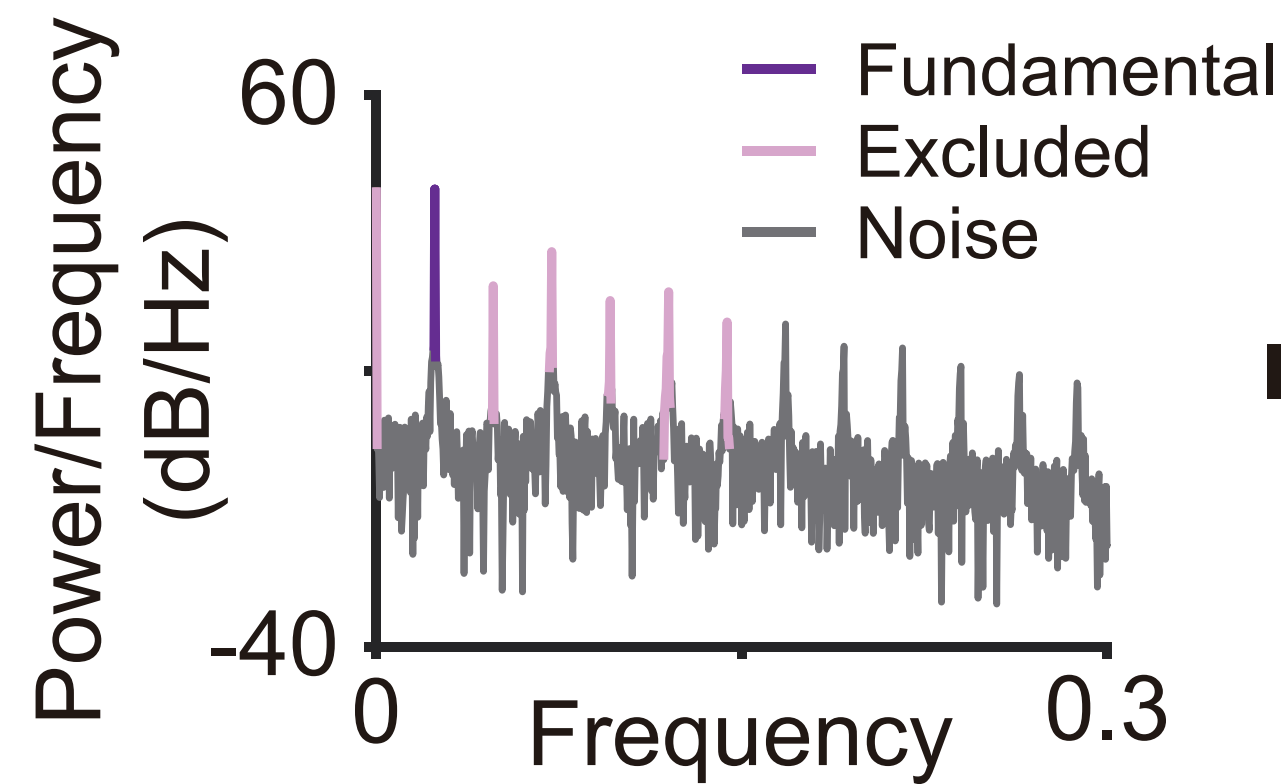


$$C(s) \approx \tilde{C}(s) = e^{-s/\eta} \cos\left(\frac{2\pi s}{T}\right)$$

➔ **Period = T**

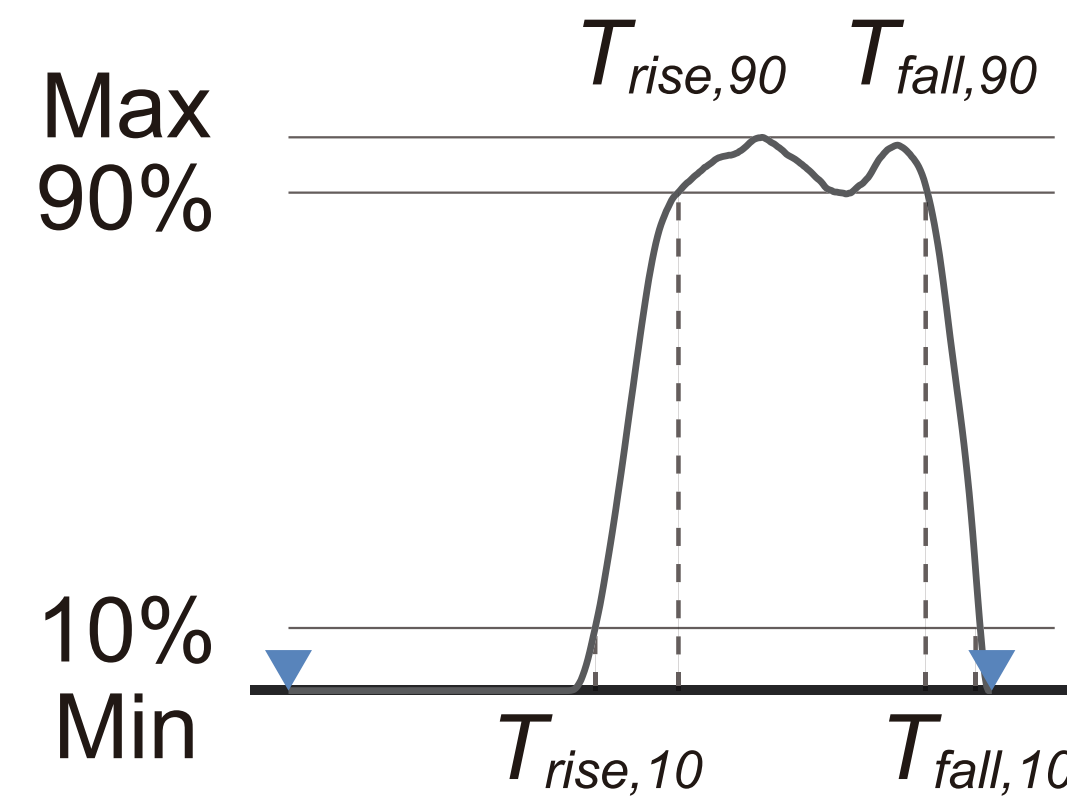
Splitting into multiple trajectories with 10 cycles

(iii)



➔ **Signal-to-noise ratio (SNR)**

Smoothing with 10% neighborhood

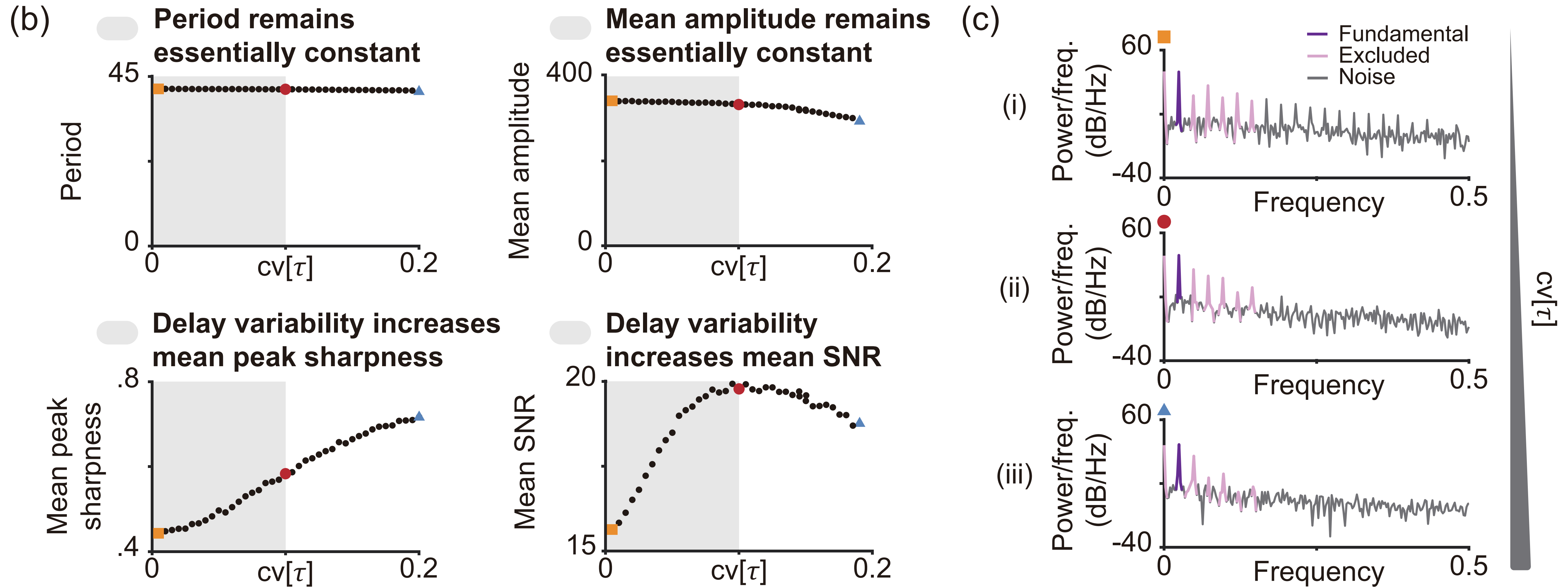


Amplitude
= Max - Min

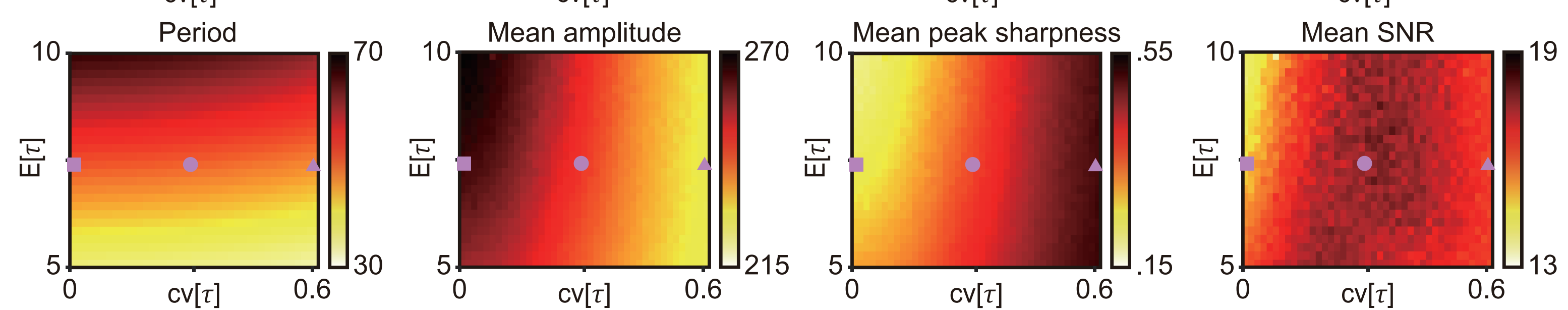
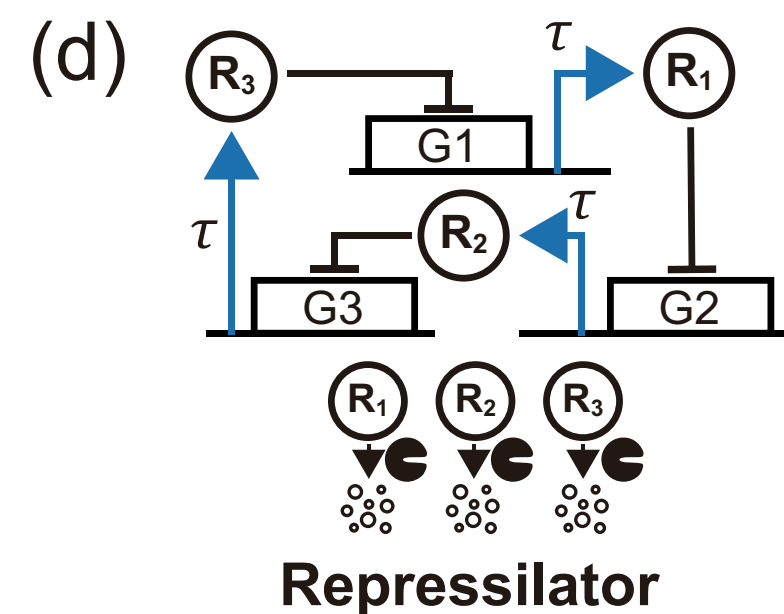
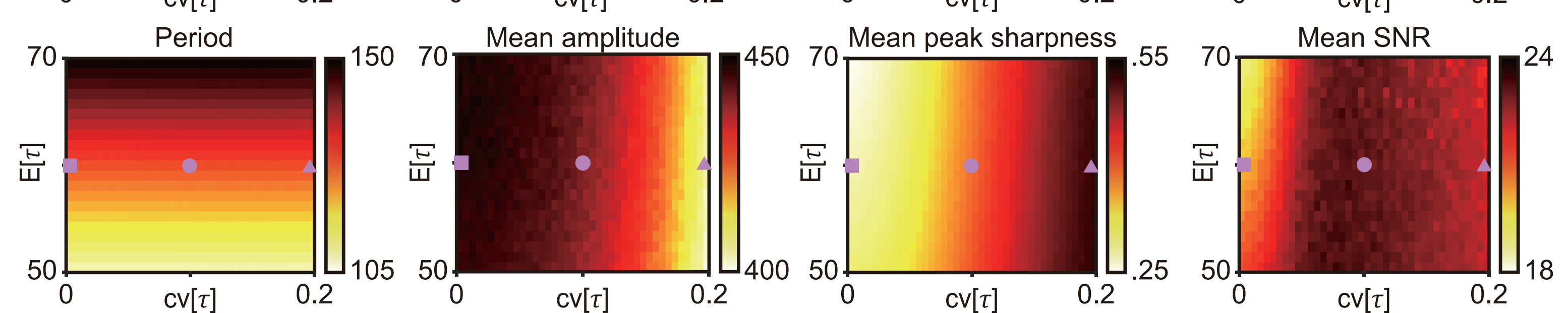
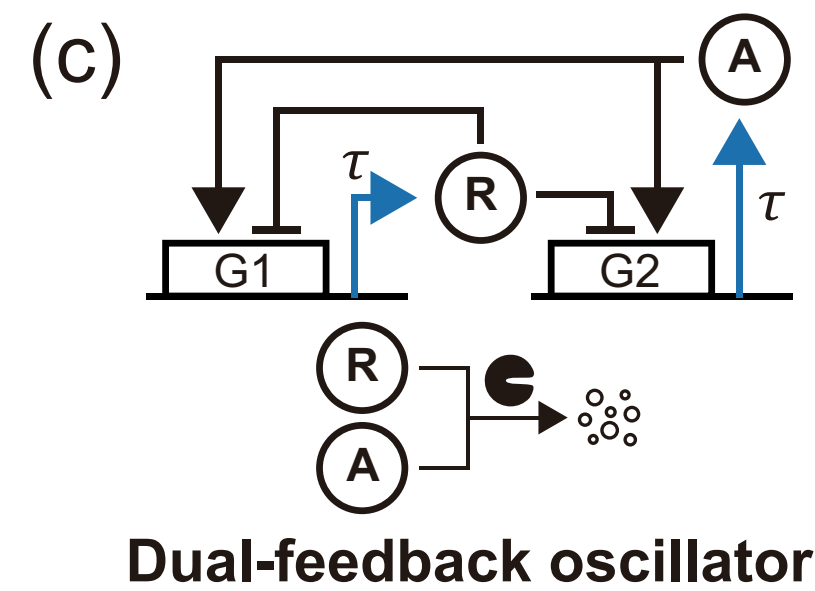
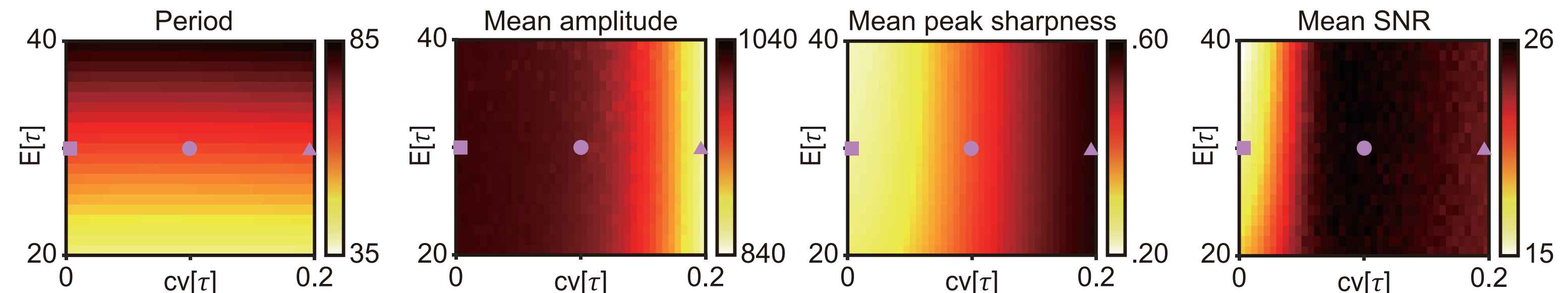
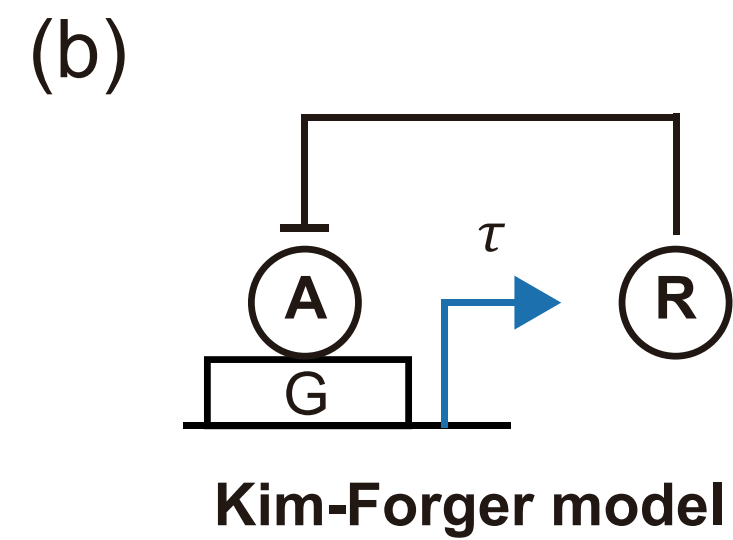
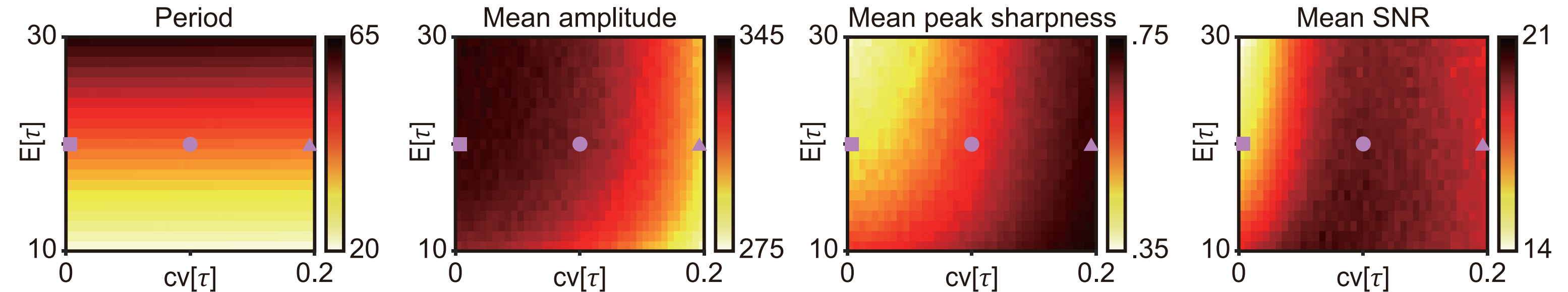
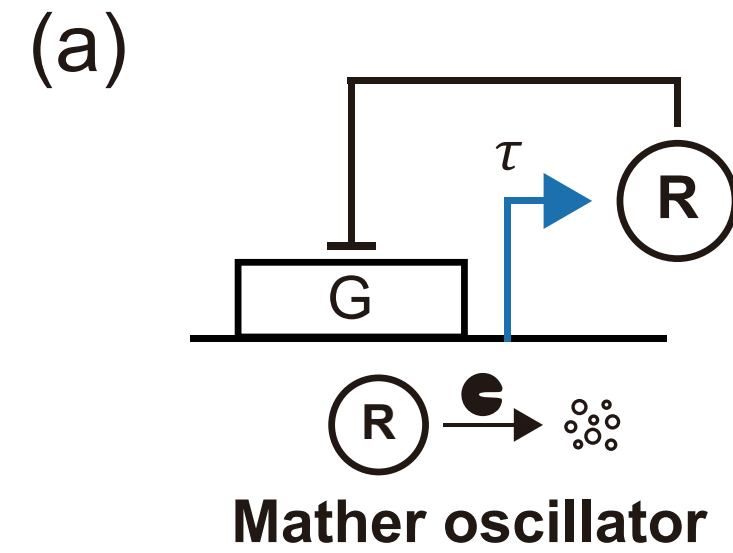
➔ **Peak sharpness**

$$= 1 - \frac{T_{fall,90} - T_{rise,90}}{T_{fall,10} - T_{rise,10}}$$

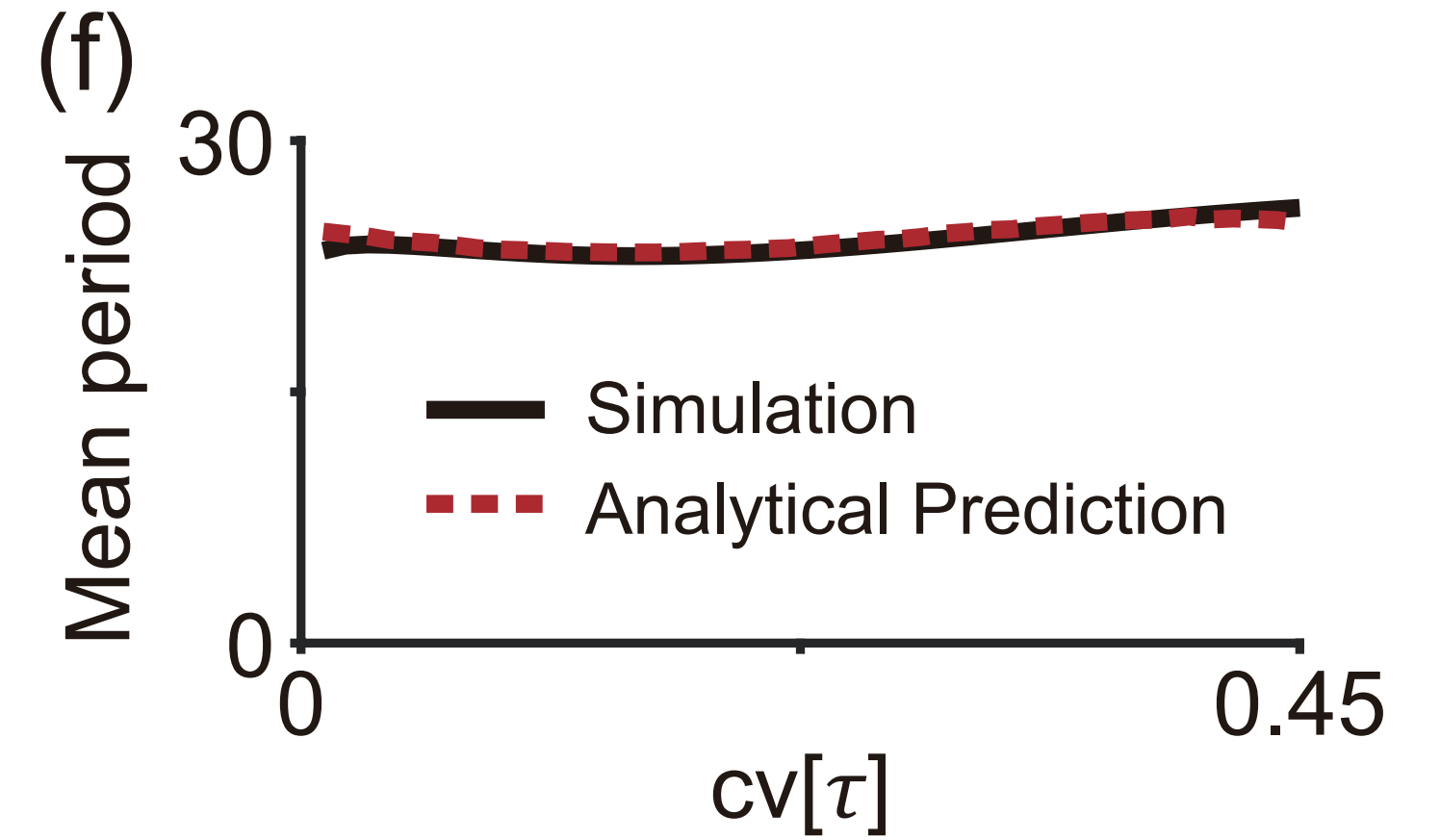
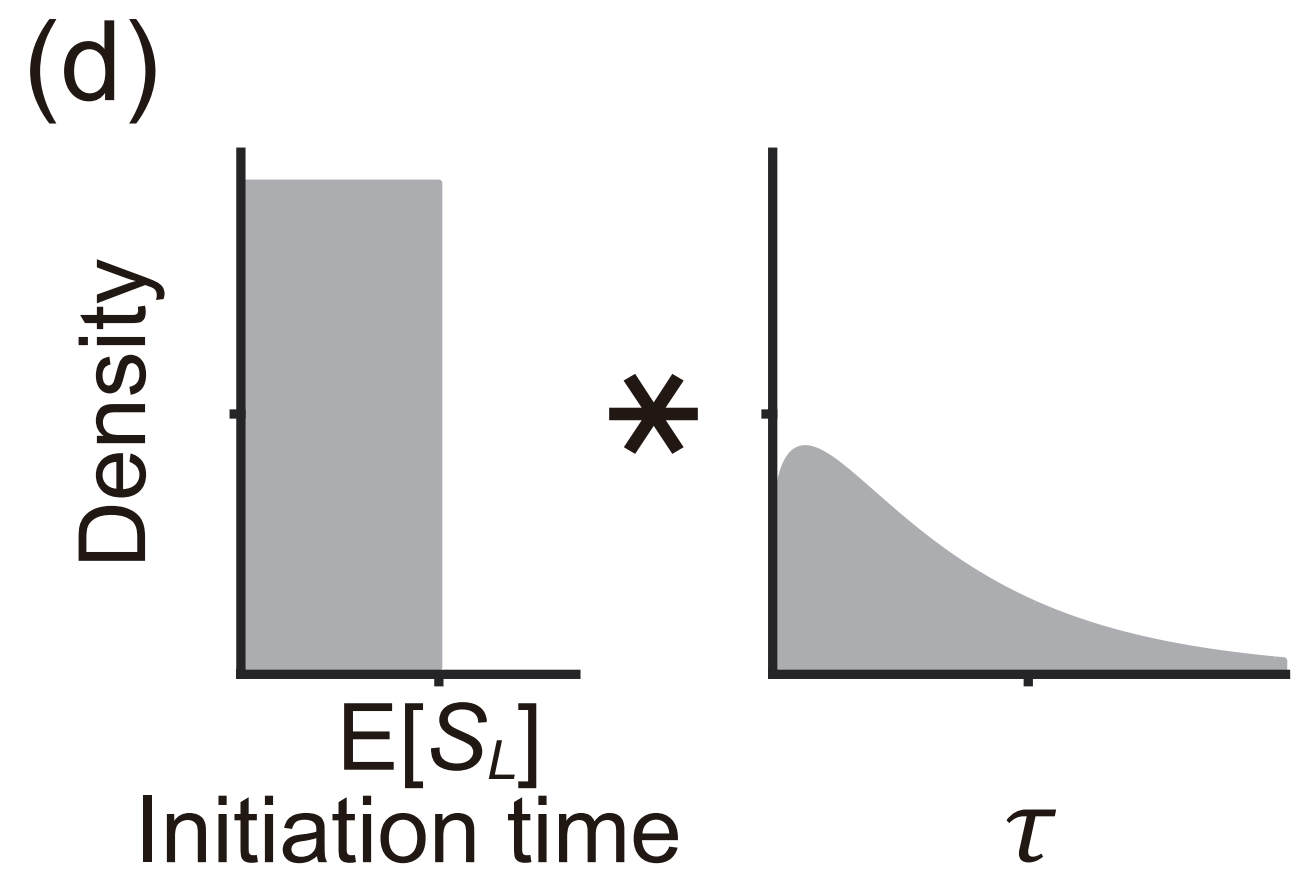
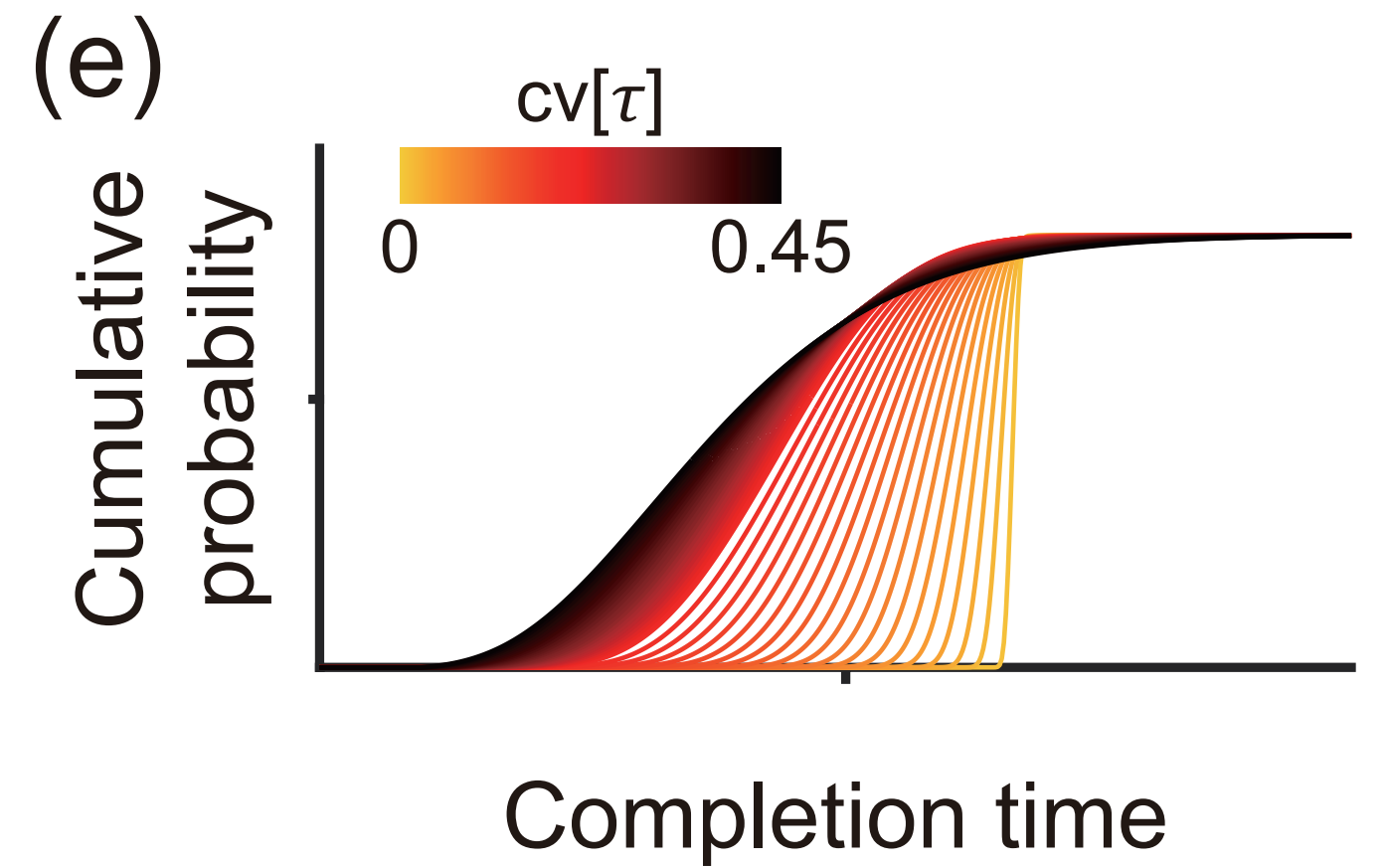
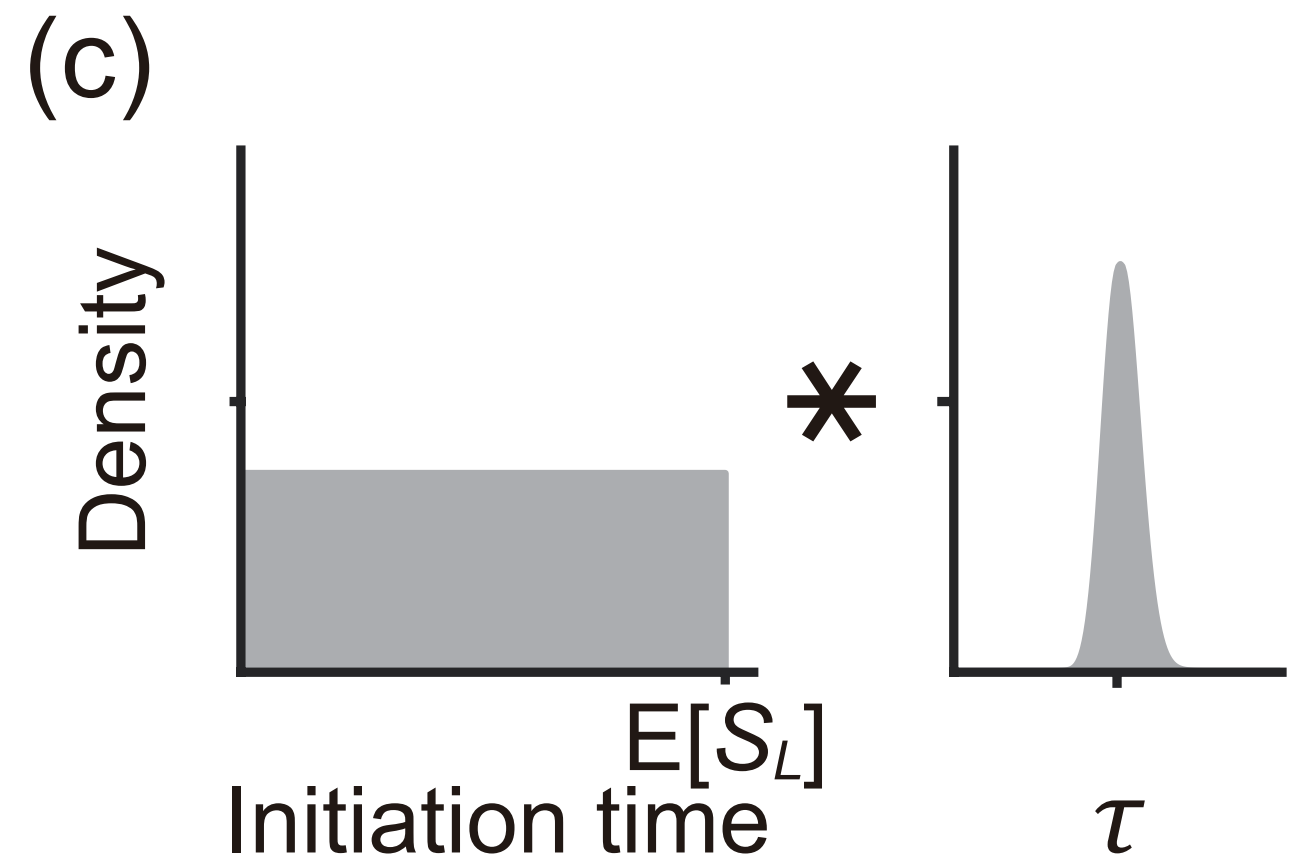
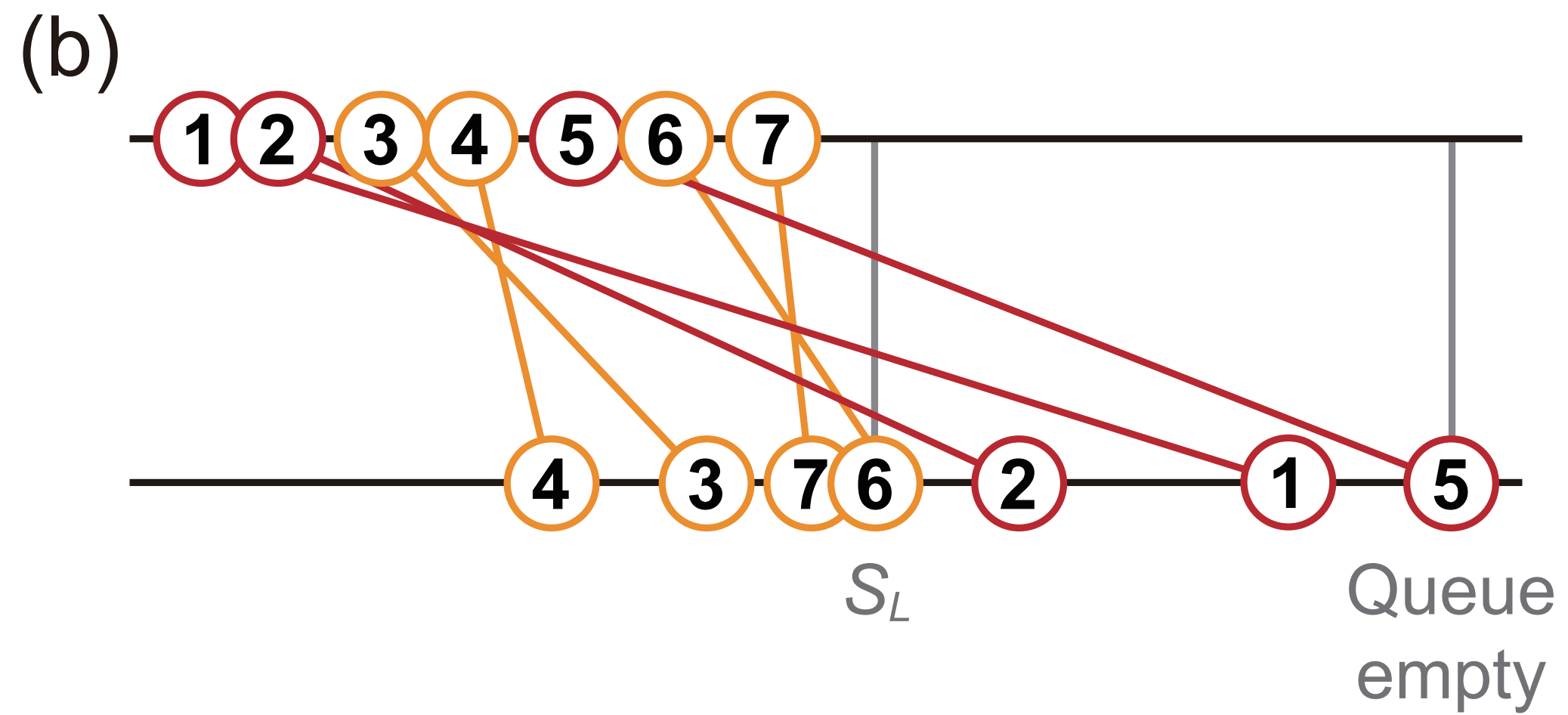
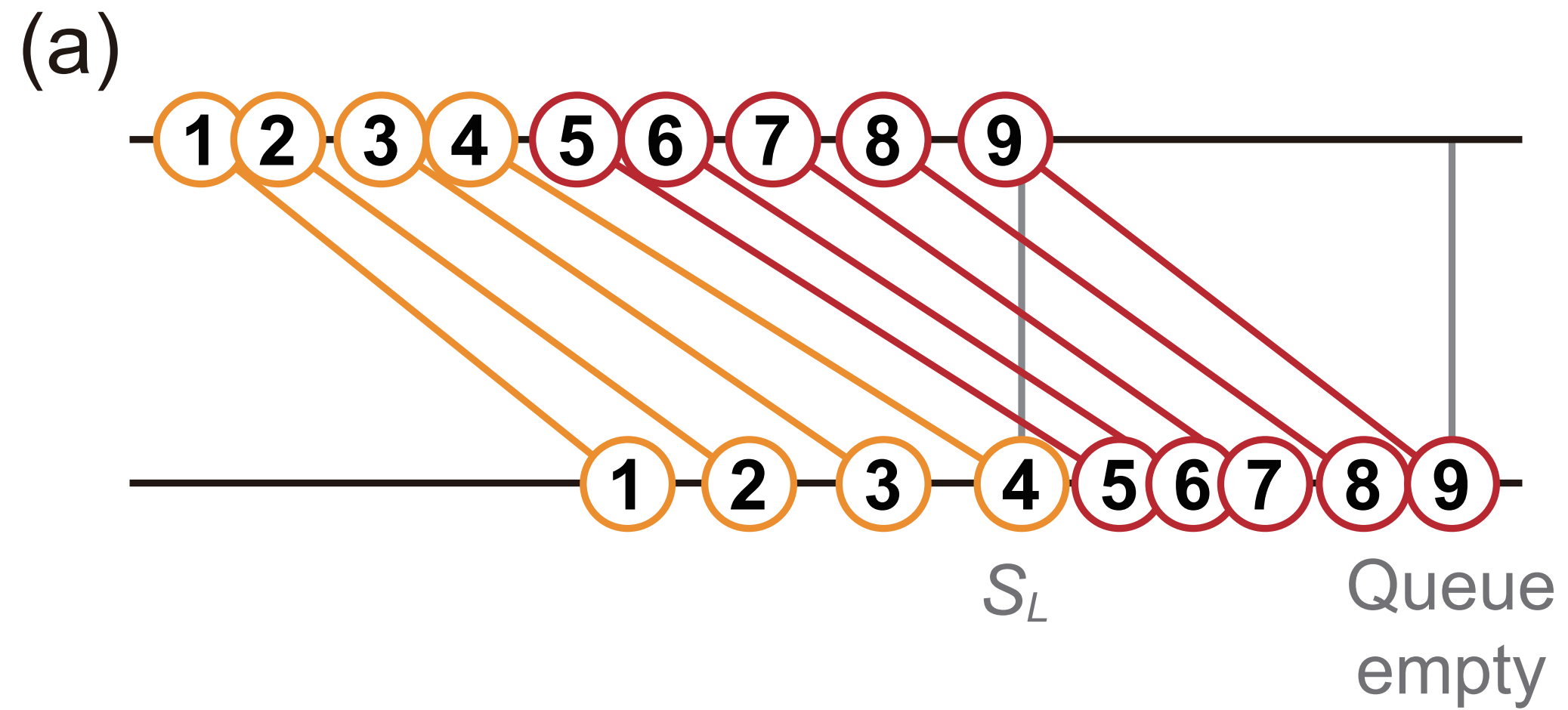
Distributed delay acts constructively: Denoising



Denoising occurs for a variety of models



Queueing theory explains why period remains stable



Part 3: Delayed positive feedback, fixed delay

How does fixed delay impact bistable switches?

[Gupta et alii, Transcriptional delay stabilizes bistable gene networks, PRL, 2013]

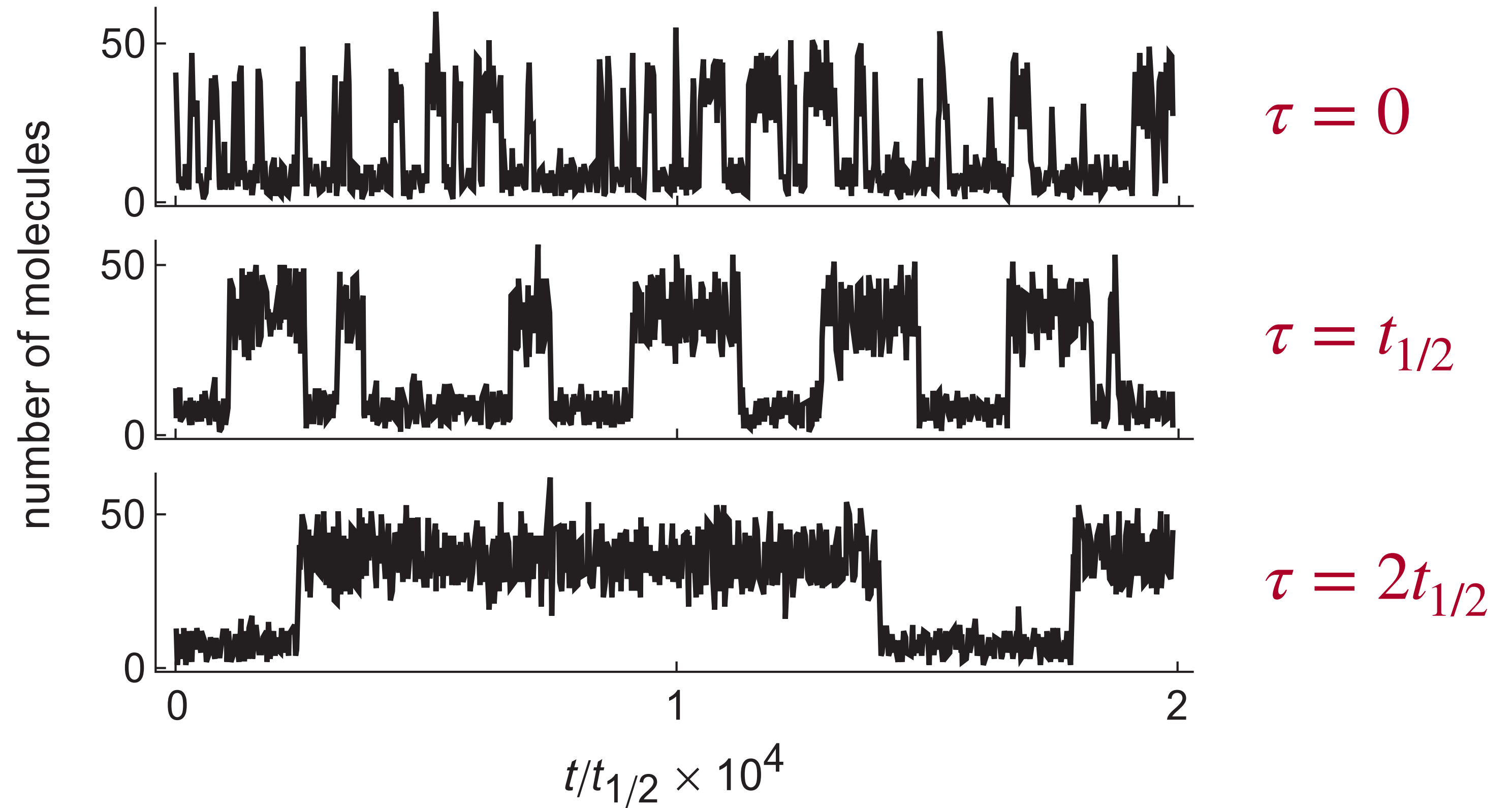
A single-gene positive feedback loop: Intriguing data

$$\dot{x} = \underbrace{\alpha + \beta \frac{x(t - \tau)^b}{c^b + x(t - \tau)^b}}_{\text{birth}} - \underbrace{\gamma x}_{\text{death}}$$

tune for bistability

dSSA simulations →

$t_{1/2}$ = protein half-life



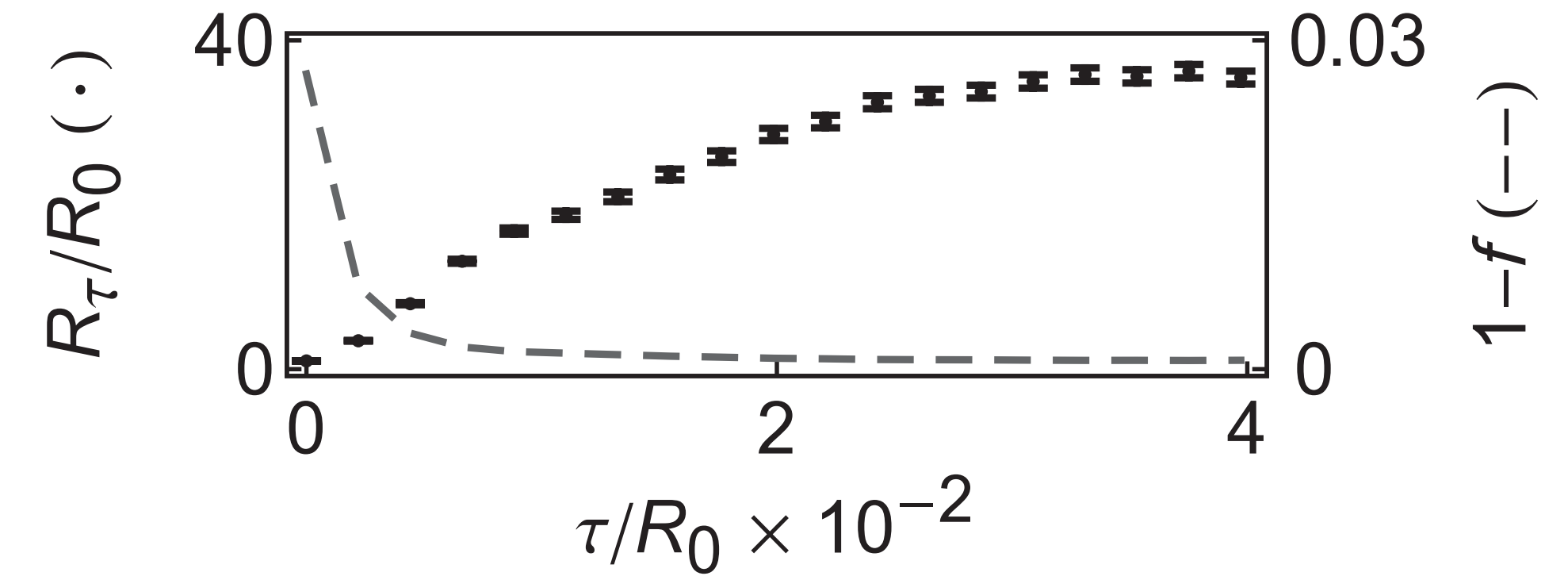
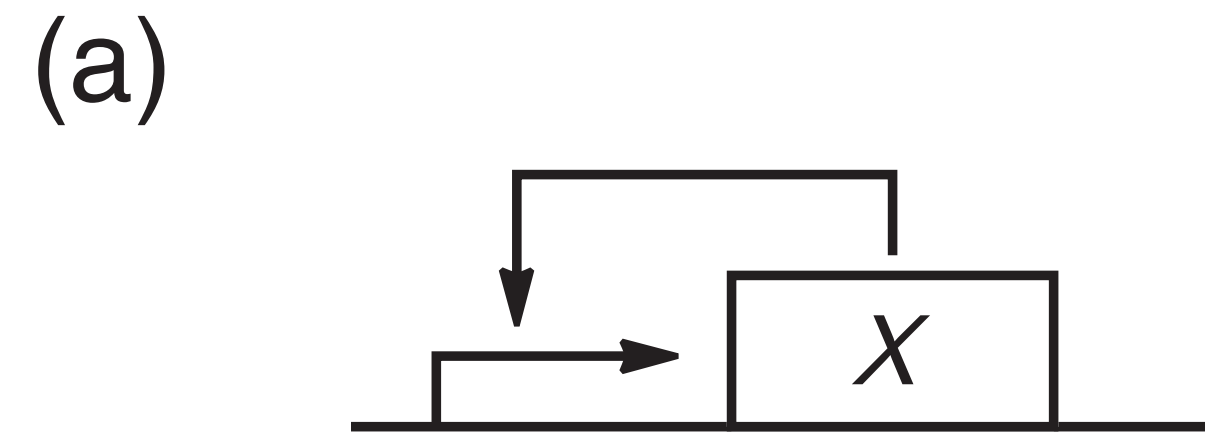
Mean residence time: A metric for metastability

Let R_τ denote mean residence time in the metastable states.

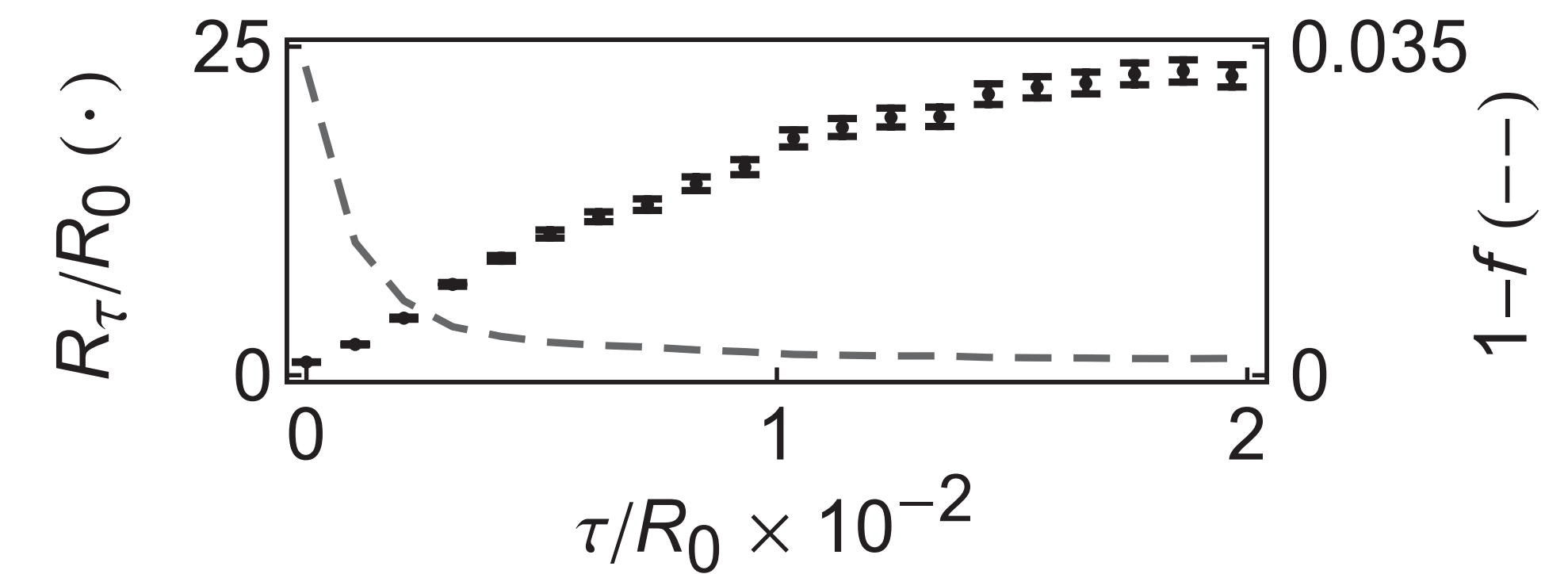
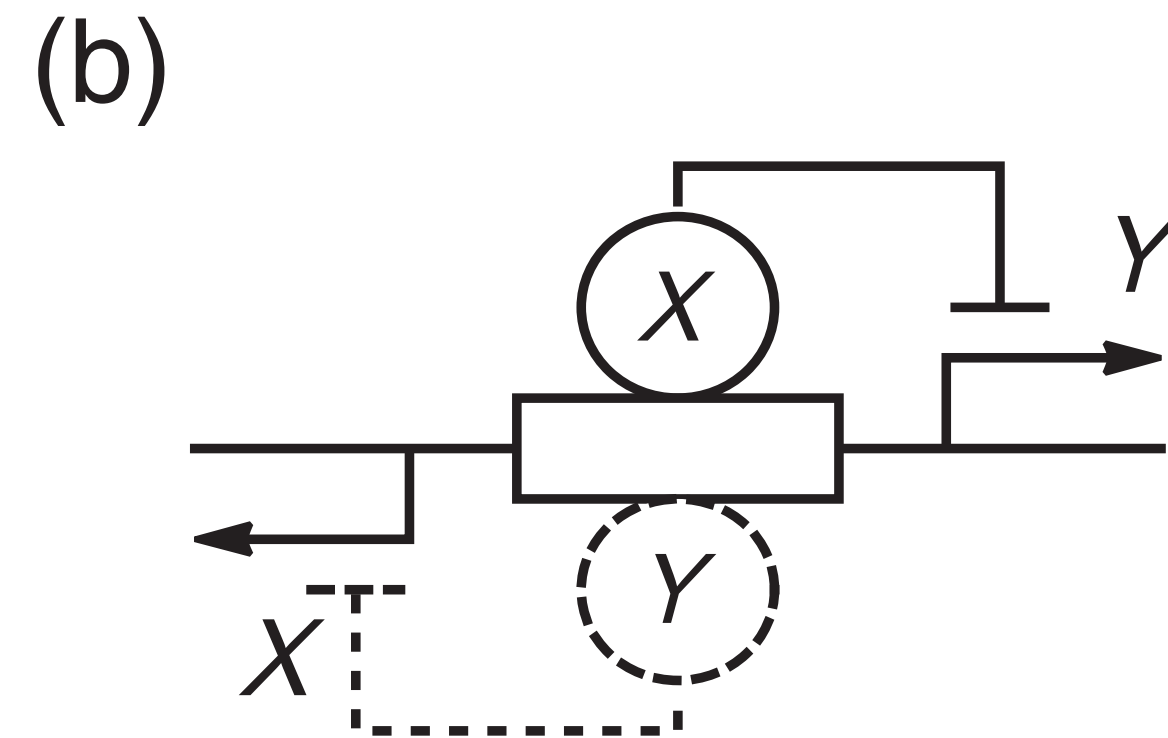
QUESTION. How does R_τ vary with fixed delay τ ?

Significant stabilization of metastable states is prevalent!

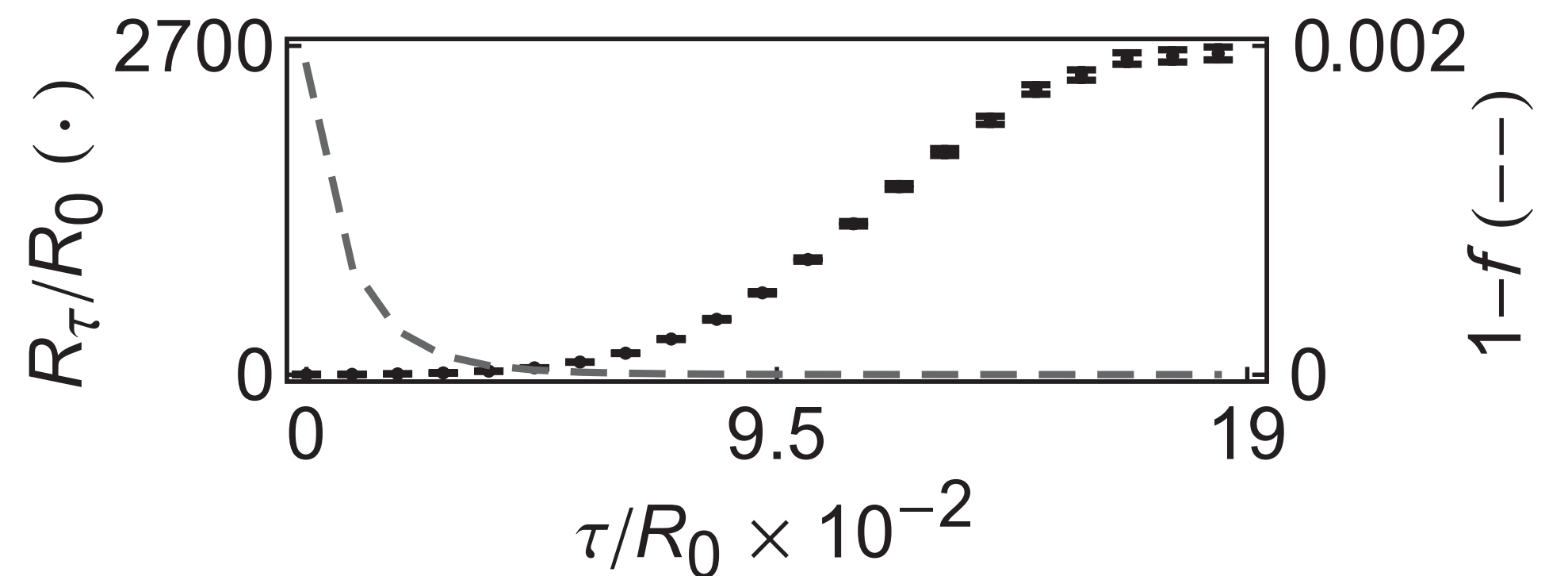
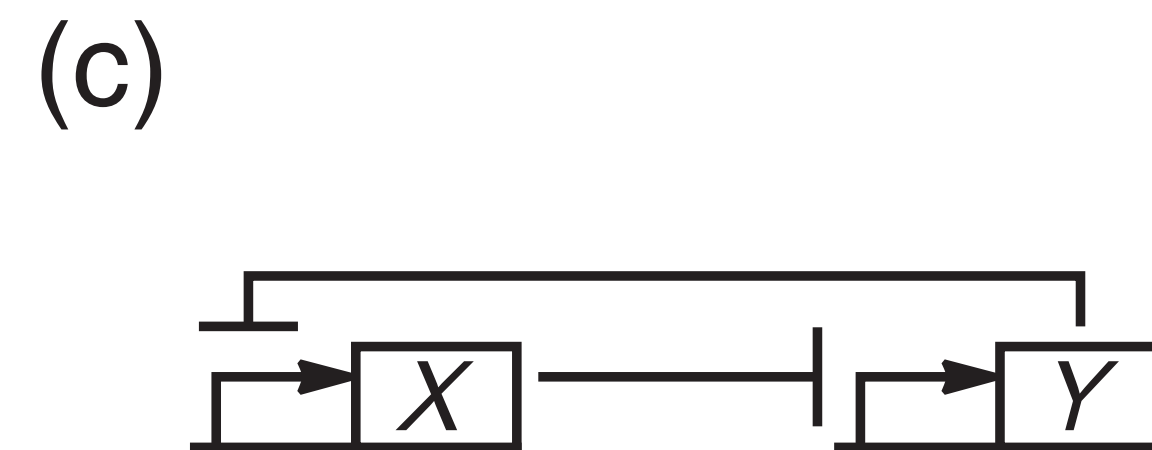
single-gene
positive feedback
loop



bacteriophage- λ
switch



co-repressive
toggle switch



In search of an explanation for the dramatic stabilization

QUESTION 1. Is there a local explanation for the stabilization?

QUESTION 2. Do the fixed points become more stable as τ increases?

In search of an explanation for the dramatic stabilization

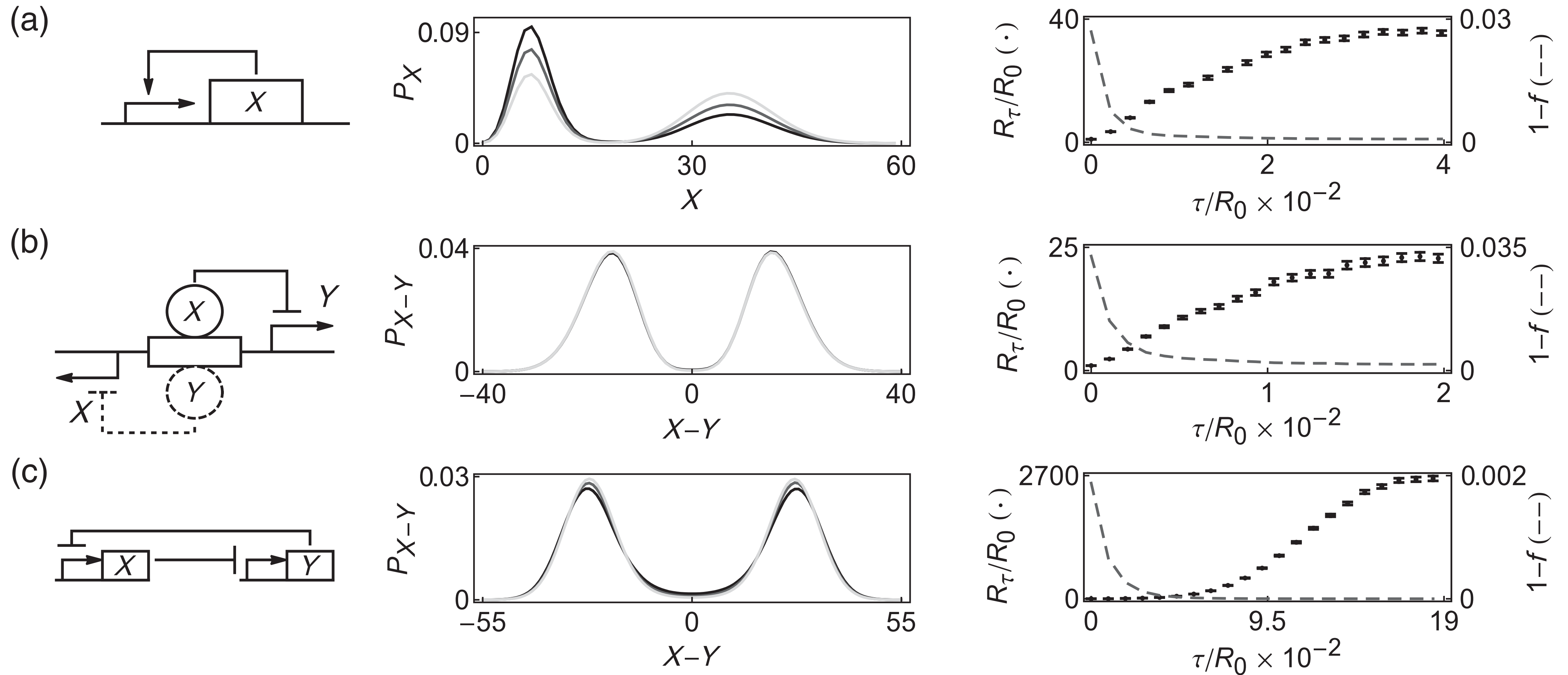
QUESTION 1. Is there a local explanation for the stabilization?

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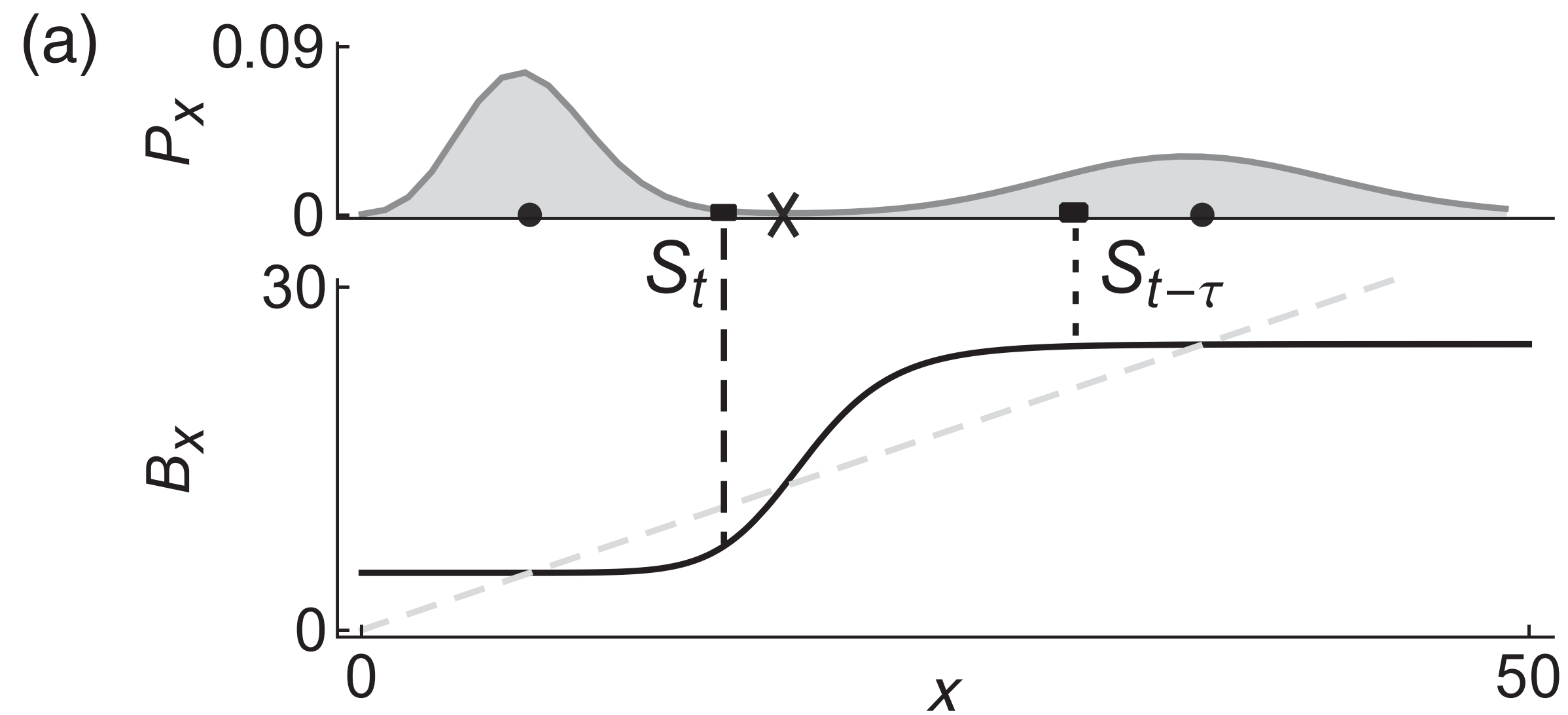
Answer to Q2: No. In fact, the fixed points can become less stable as τ increases!

The mystery deepens: Stationary distributions

lighter shade indicates larger delay



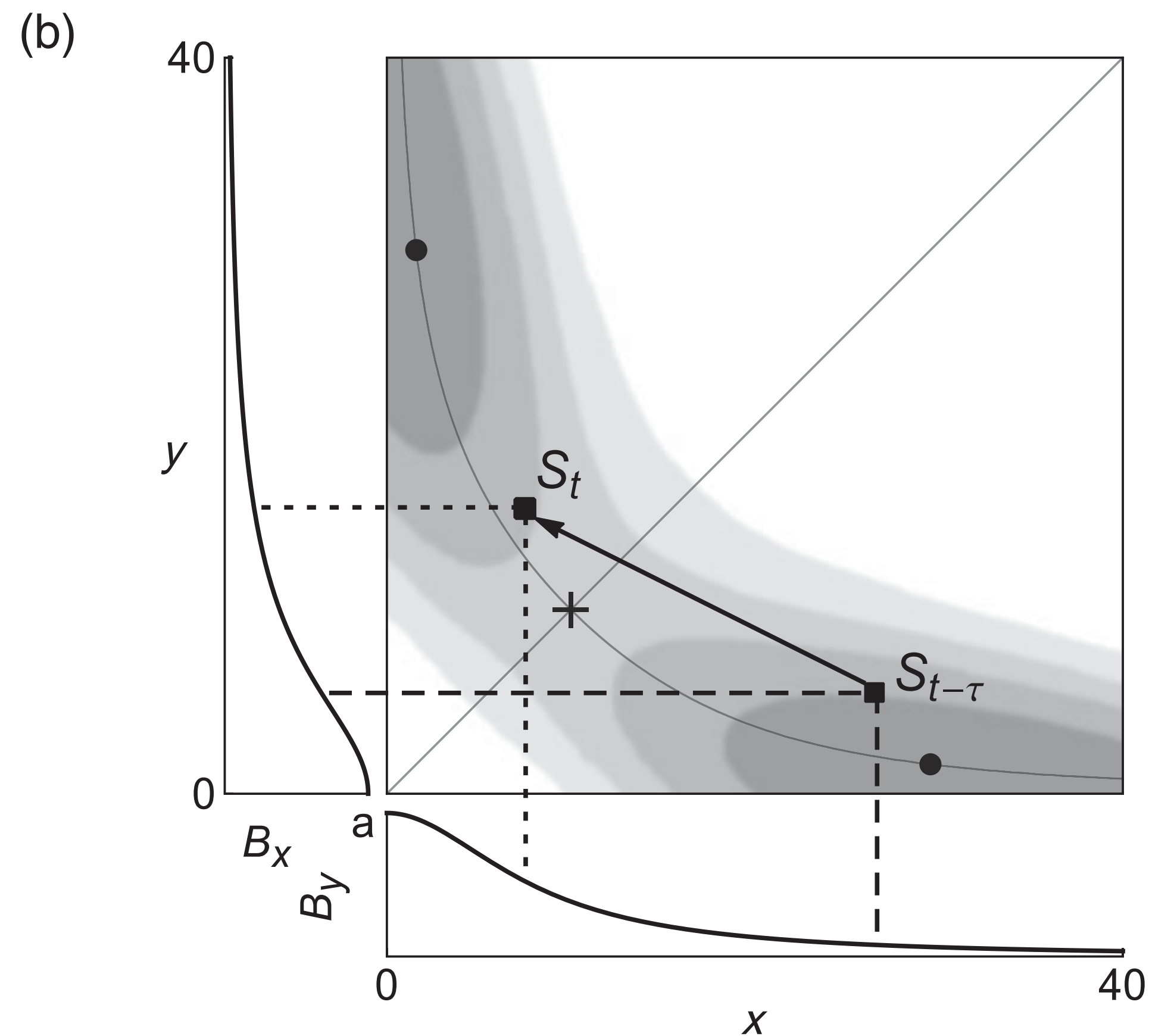
Resolution: A rubber-band effect



single-gene positive feedback loop

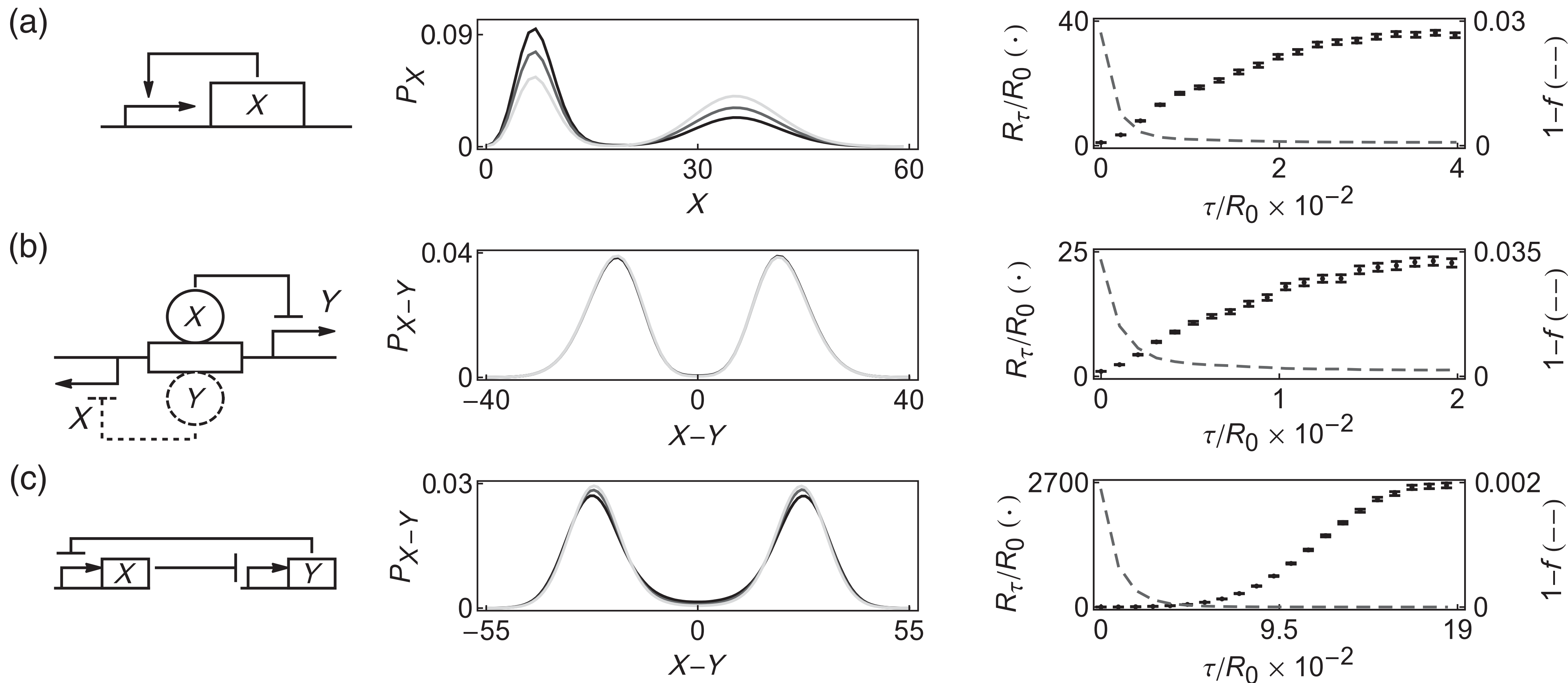
Transition attempts are increasingly likely to fail as τ increases!

co-repressive toggle switch



Data supports the rubber-band theory

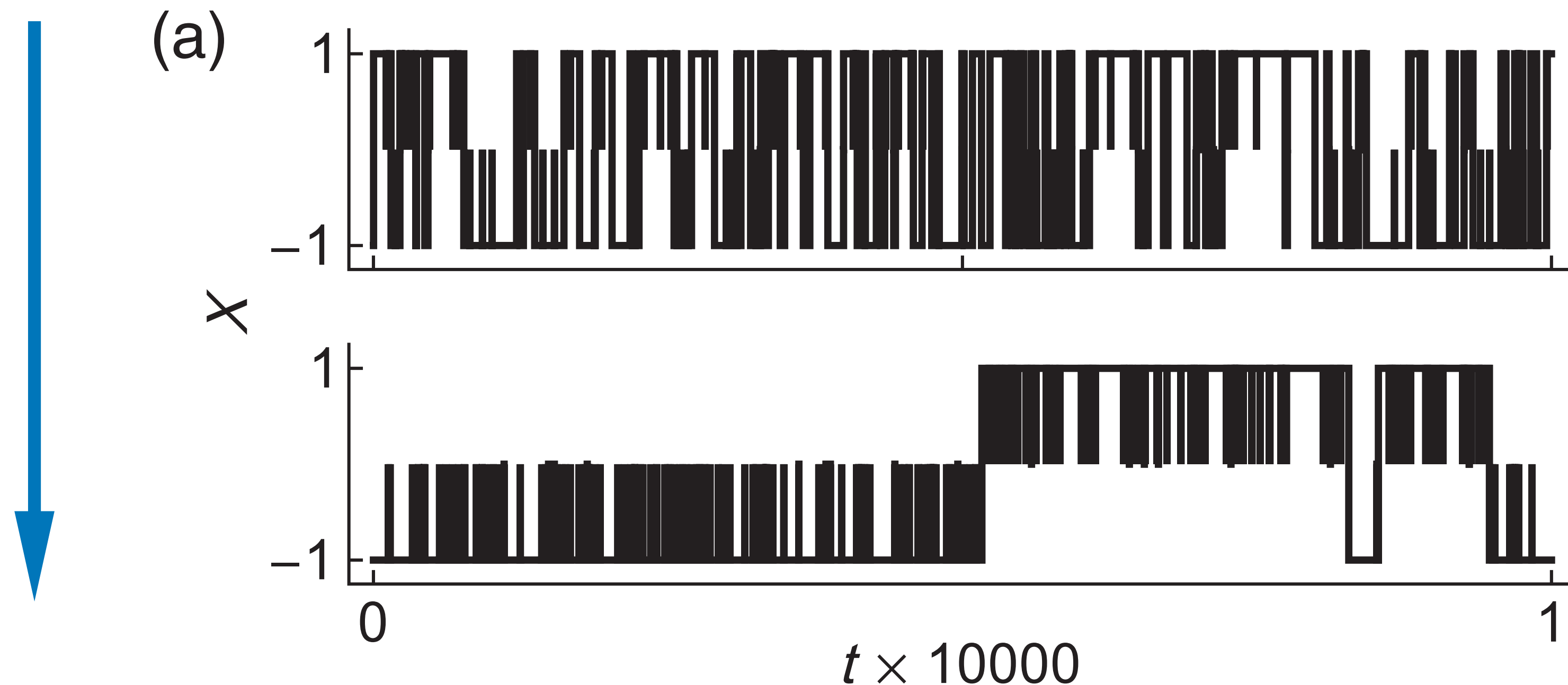
dashed line indicates the probability of a successful transition



A 3-states model captures the rubber-band effect

- non-Markovian symbolic model
- state space: $\{L, I, H\}$
- transition rates: $\lambda_{j,k}^i$ (rate of transition from state j to state k , given that τ units of time in the past, the system was in state i)

τ increases



Part 4: Delayed positive feedback, distributed delay

This is work in progress! Chat with Amanda Alexander.

Thank you!