

# Large deviations for Gaussian diffusions with delay

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MS52: Stochastic analysis with applications  
in biology and evolutionary dynamics

SIAM Conference on Applications of Dynamical Systems  
May 2017

# Outline

Prologue

Metastability and delay

Gaussian diffusions with delay

Epilogue: Cell cycle effects

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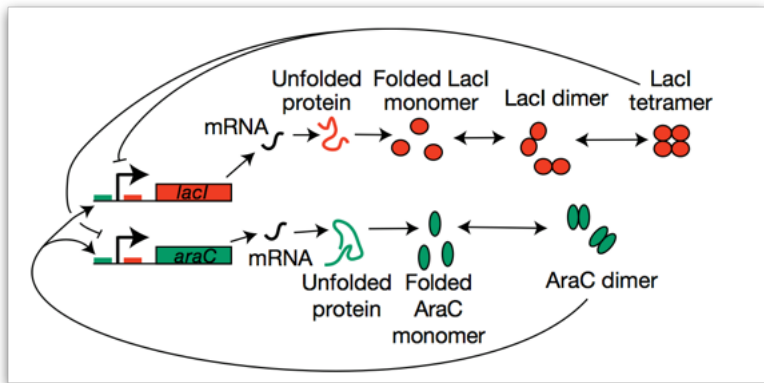
Epilogue: Cell cycle effects

# Motivation

- ▶ Interplay between delay and stochasticity – subtle and complex
- ▶ Can delay act constructively?

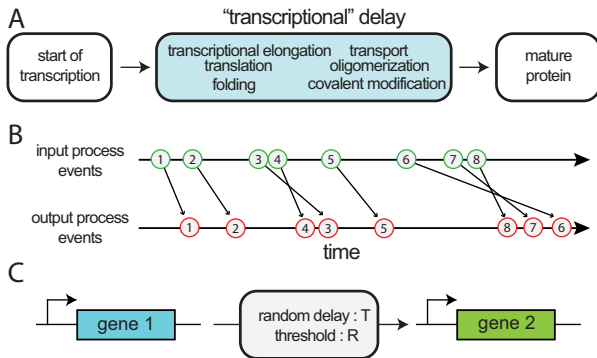
# Origin of delay in genetic networks

- ▶ 'Transcriptional' delay



# Protein synthesis as a queueing system

- ▶ Hasty, Mather, Tsimring, and Williams, et al.



# Delay acts constructively!

- ▶ Accelerates signaling in genetic network pathways
  - ▶ Josić, López, Ott, Shiau, Bennett (PCB)
- ▶ Stabilizes metastable systems with positive feedback architectures
  - ▶ Gupta, López, Ott, Josić, Bennett (PRL)
- ▶ Questions
  - ▶ How?
  - ▶ Quantification?

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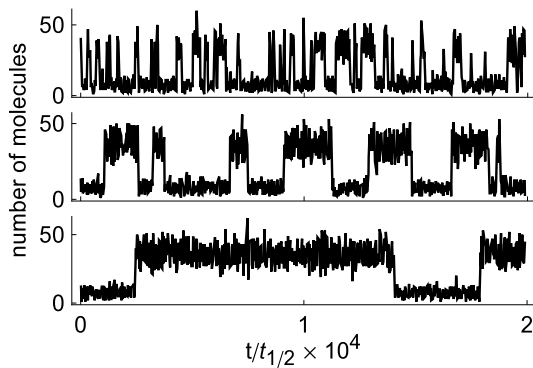
Gaussian diffusions with delay

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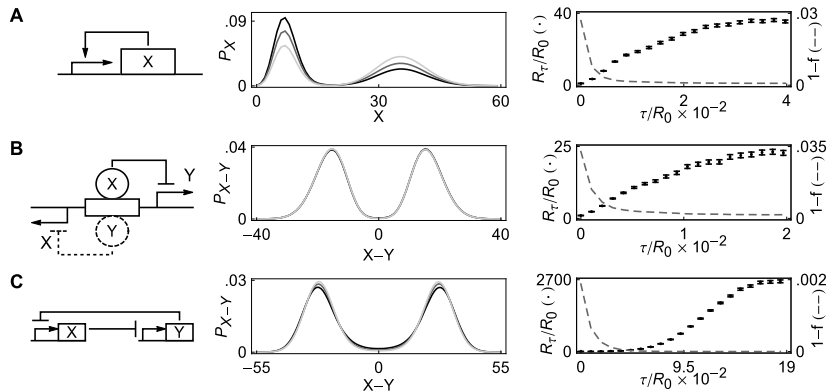
# Results from direct simulations

- ▶ Traces: **single-gene positive feedback circuit**

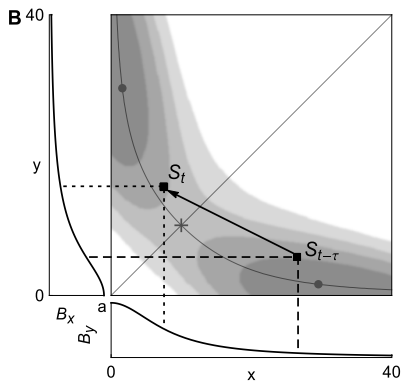
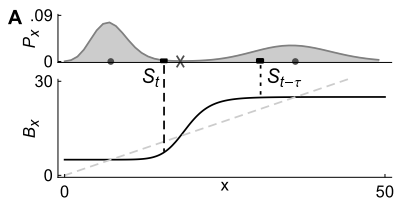


# Results from direct simulations

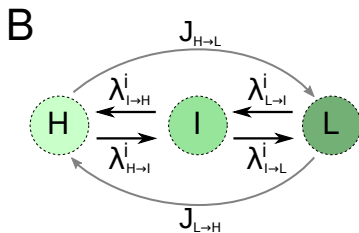
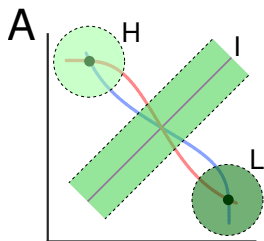
- Delay stabilizes metastable states: Generality



# Explanation: Sisyphus



# A symbolic reduction



- ▶ Examine the  $H \rightarrow I \rightarrow L$  transition
- ▶ Key assumptions
  - ▶ Rubber band effect

$$p_{I \rightarrow H}^H := \frac{\lambda_{I \rightarrow H}^H}{\lambda_{I \rightarrow H}^H + \lambda_{I \rightarrow L}^H} > \frac{\lambda_{I \rightarrow H}^I}{\lambda_{I \rightarrow H}^I + \lambda_{I \rightarrow L}^I} =: p_{I \rightarrow H}^I$$

- ▶ Small delay regime

## MFPT calculations

$$MFPT_{H \rightarrow L} \approx \mathbb{E}[\# \text{ failed transitions}] \times \mathbb{E}[\text{failed transition time}] \\ + \mathbb{E}[\text{successful transition time}]$$

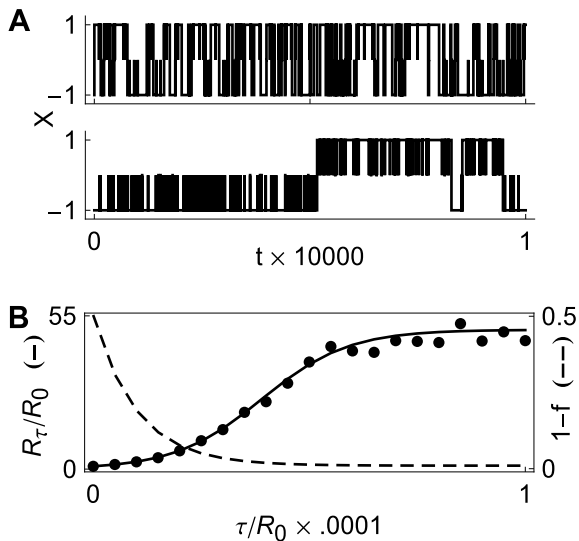
$$f := \mathbb{P}[\text{transition fails}]$$

$$f = (1 - Z(\tau))p_{I \rightarrow H}^H + Z(\tau)p_{I \rightarrow H}^L$$

$$Z(\tau) = \exp(-(\lambda_{I \rightarrow H}^H + \lambda_{I \rightarrow L}^H)\tau) \quad (\text{rapidly decreasing with } \tau)$$

$$MFPT_{H \rightarrow L} \approx \left( \frac{f}{1 - f} \right) \times \mathbb{E}[\text{failed transition time}] \\ + \mathbb{E}[\text{successful transition time}]$$

# Symbolic model exhibits desired qualitative behavior



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# Model

- ▶ Start with Langevin description (Brett and Galla; Gupta et al.)

$$dx_t = f(x(t), x(t - \tau)) dt + \varepsilon g(x(t), x(t - \tau)) dW_t$$

- ▶ Linearize near a metastable state to obtain Itô delay SDE

$$\begin{cases} dX_t^\varepsilon = (a + BX_t^\varepsilon + CX_{t-\tau}^\varepsilon) dt + \varepsilon \Sigma dW_t \\ X_t^\varepsilon = \gamma(t) \text{ for } t \in [-\tau, 0] \end{cases}$$

- ▶ Goal: solve exit problem



# Large deviations framework

$$\mathbb{P}_x \left\{ \sup_{0 \leq t \leq T} |X^\varepsilon(t) - \psi(t)| \leq \delta \right\} \approx \exp(-\varepsilon^{-1} S_T(\psi)) \quad (\text{LDP})$$

- ▶  $\psi \in C([0, T], \mathbb{R}^d)$
- ▶  $S_T$ : action (or energy) of  $\psi$
  
- ▶ Minimizing over  $\psi$  then  $T$  produces the **quasi-potential**
  - ▶ Most likely transition pathways
  - ▶ Mean first passage times

## Azencott, Geiger, Ott: Explicit theory for the linear case

$$\begin{cases} dX_t^\varepsilon = (a + BX_t^\varepsilon + CX_{t-\tau}^\varepsilon) dt + \varepsilon \Sigma dW_t \\ X_t^\varepsilon = \gamma(t) \text{ for } t \in [-\tau, 0] \end{cases}$$

- ▶ Explicit formula for the action (energy) via the Cramér transform
- ▶ Fast numerical computation of optimal transition pathways, quasi-potential
- ▶ Methods scale nicely with dimension

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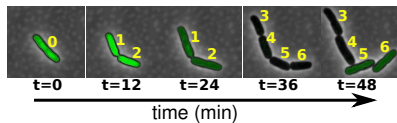
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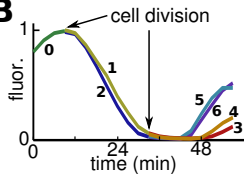
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# Modeling the cell cycle

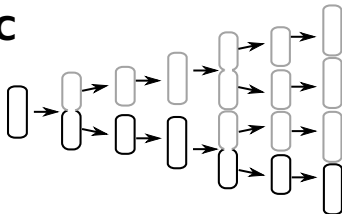
**A**



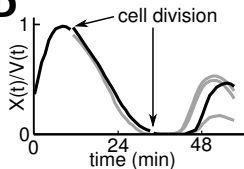
**B**



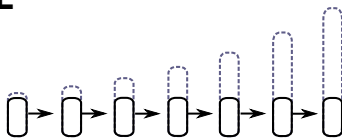
**C**



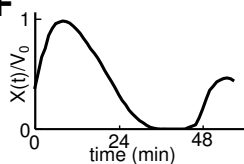
**D**



**E**



**F**



# A concentration effect

