

An Energy Balance Model for Arctic Sea Ice

Kaitlin Hill

October 10, 2017



Outline

Motivation: Arctic sea ice decline

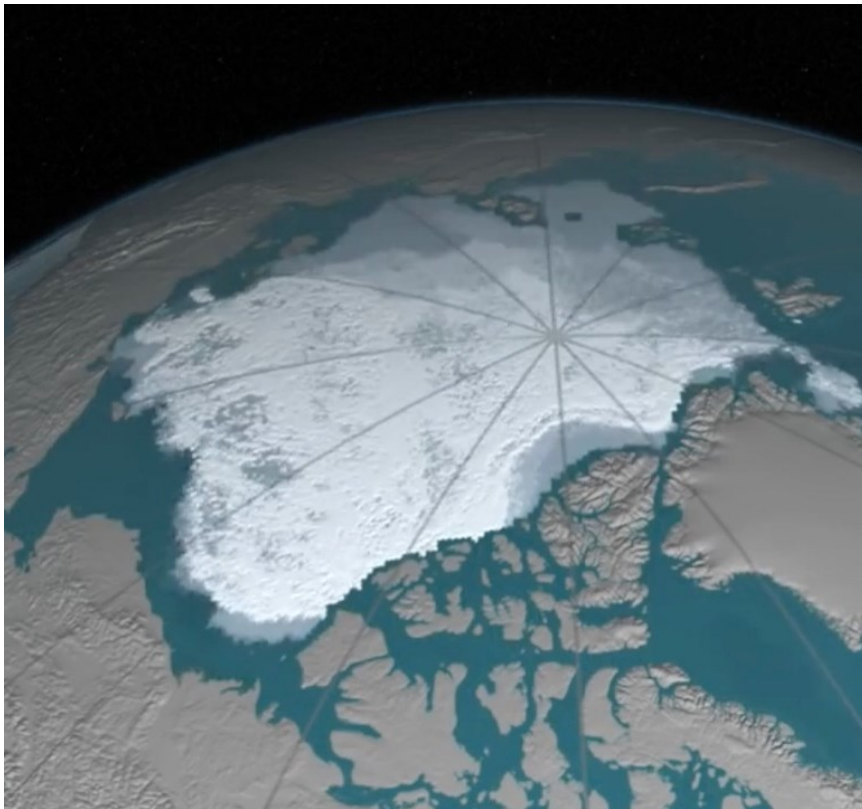
Energy balance model

Bifurcation analysis

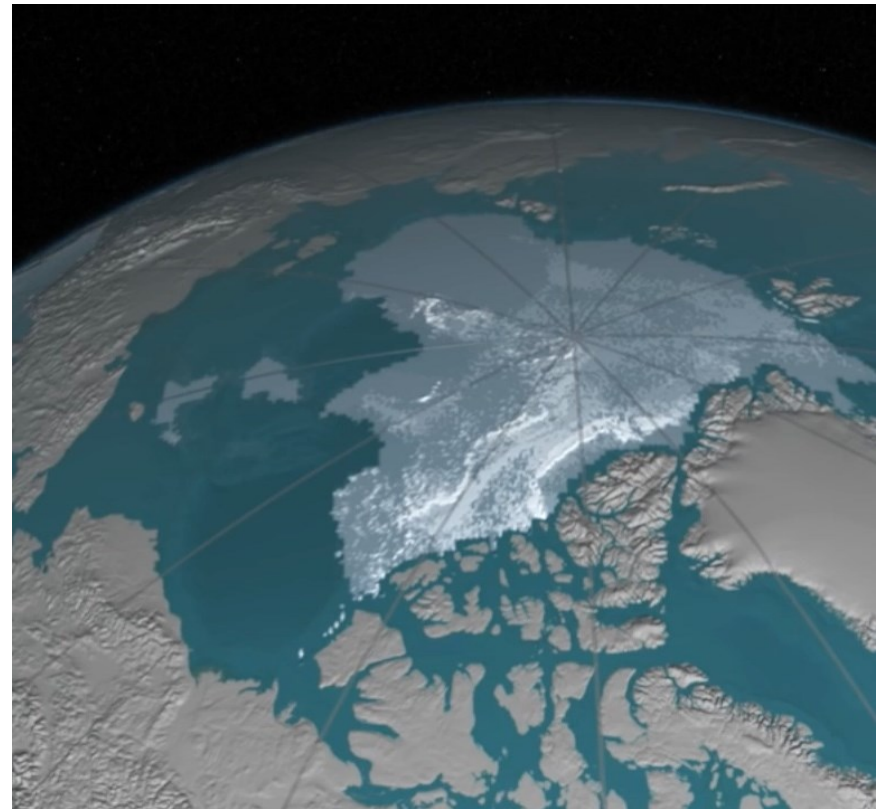
Results

Arctic sea ice age

Sept 1986

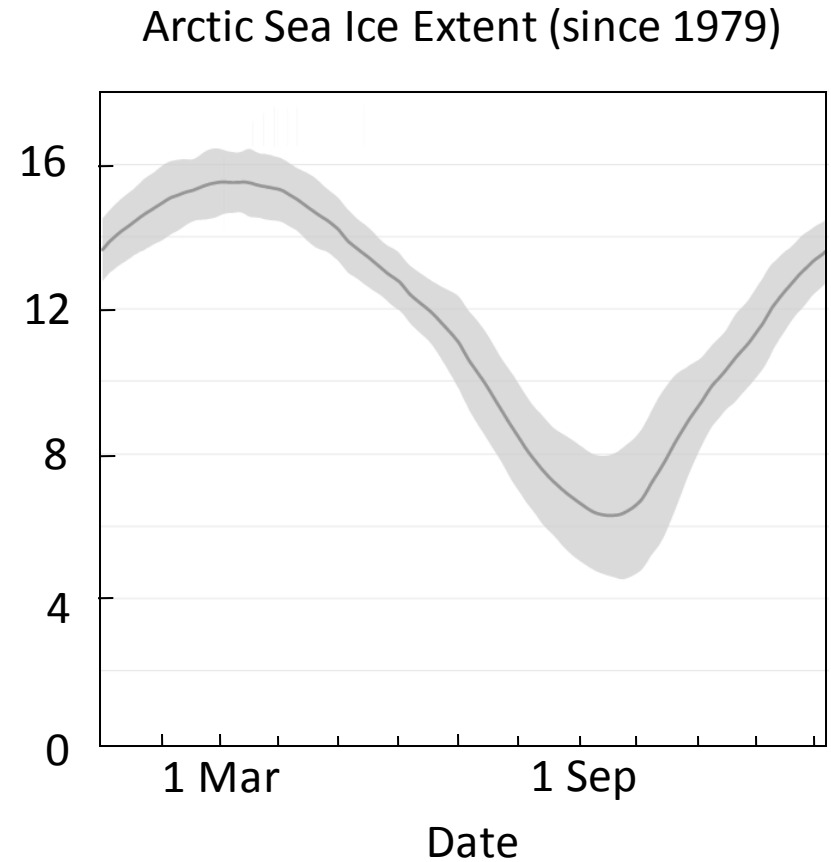
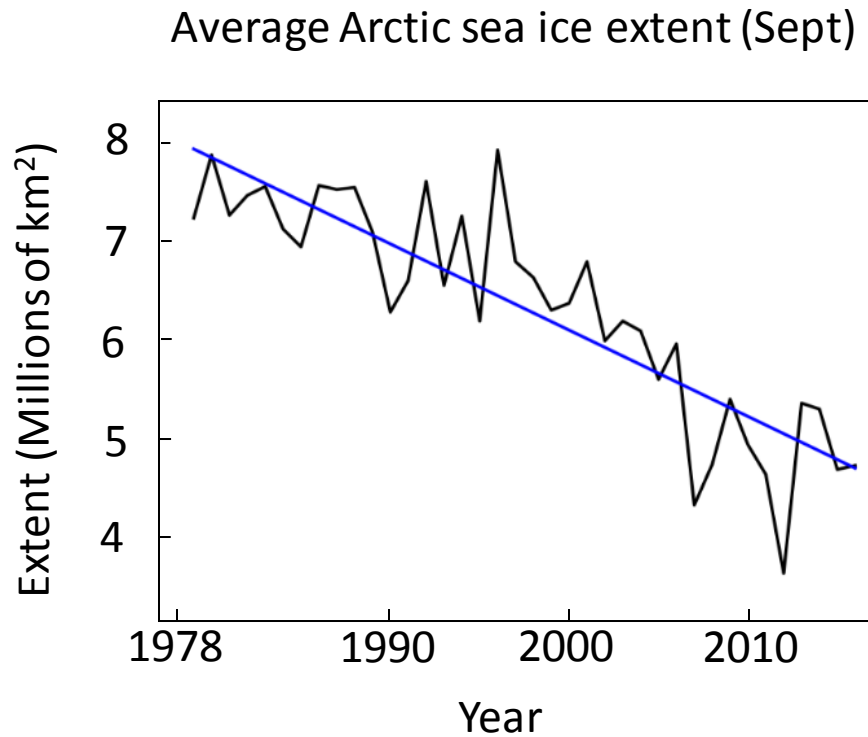


Sept 2016

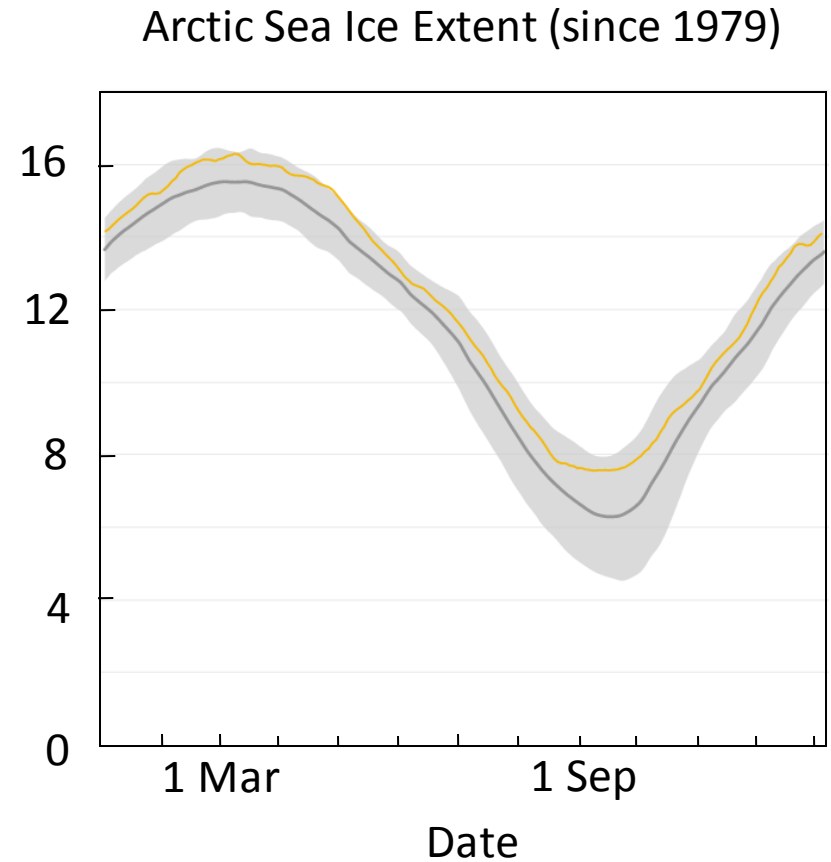
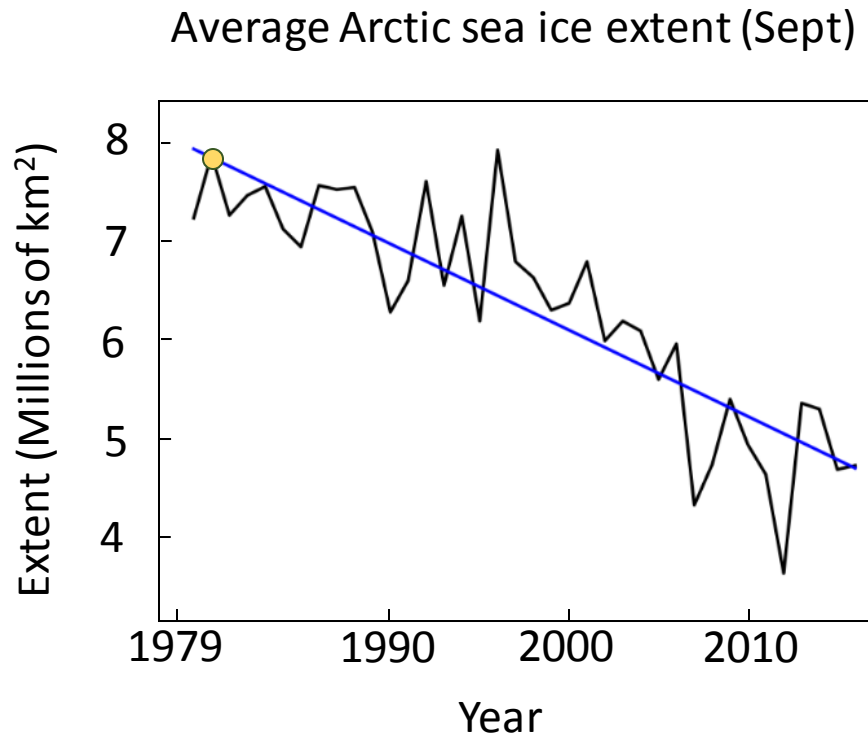


(NASA Scientific Visualization Studio)

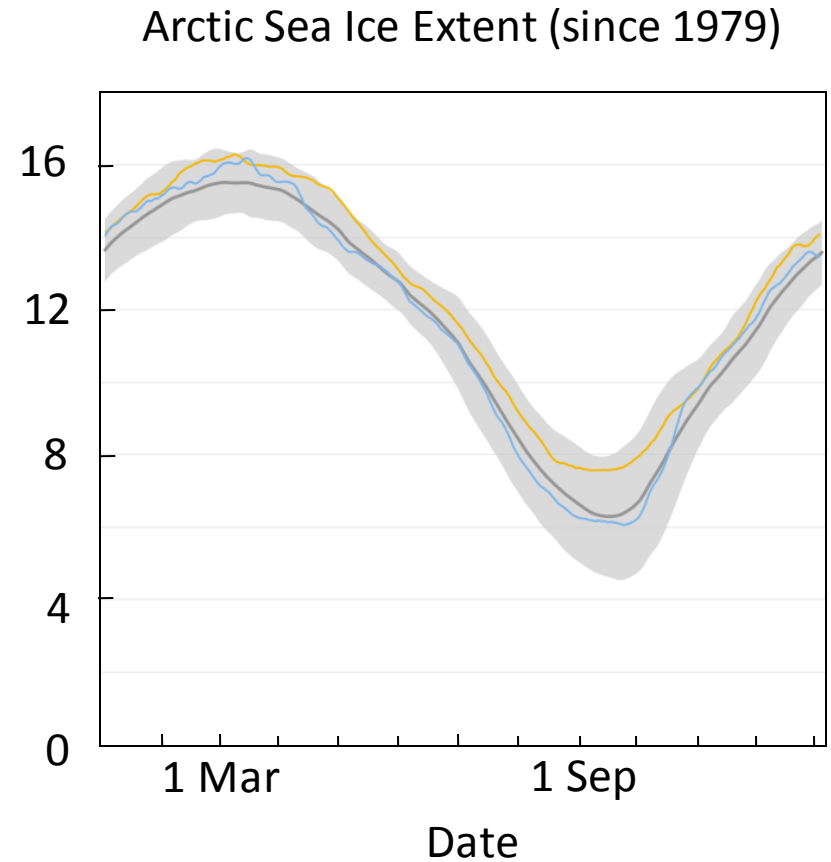
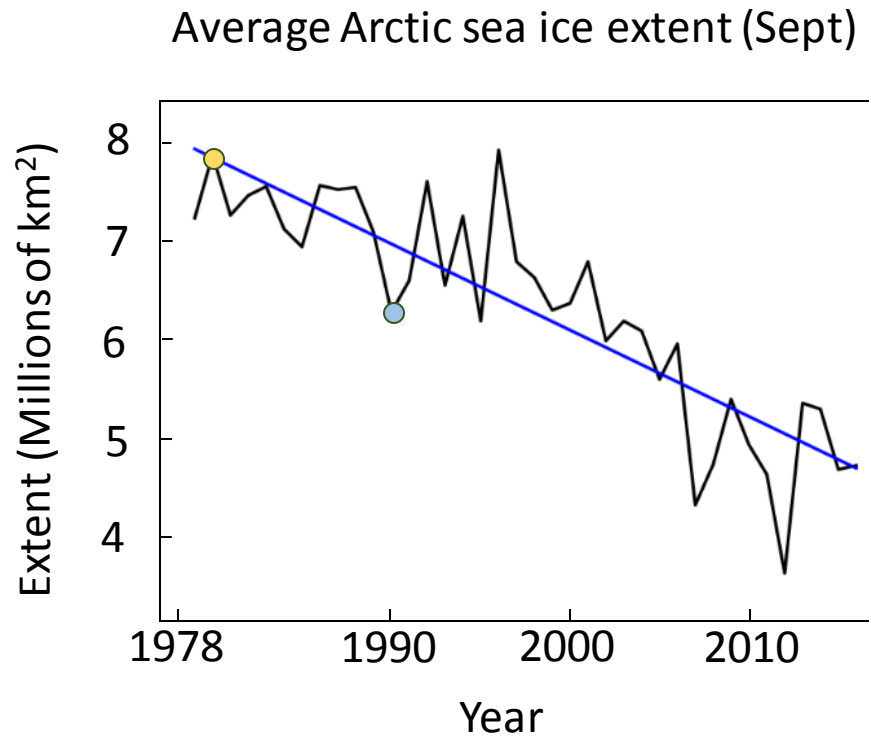
Recent decline in Arctic sea ice extent



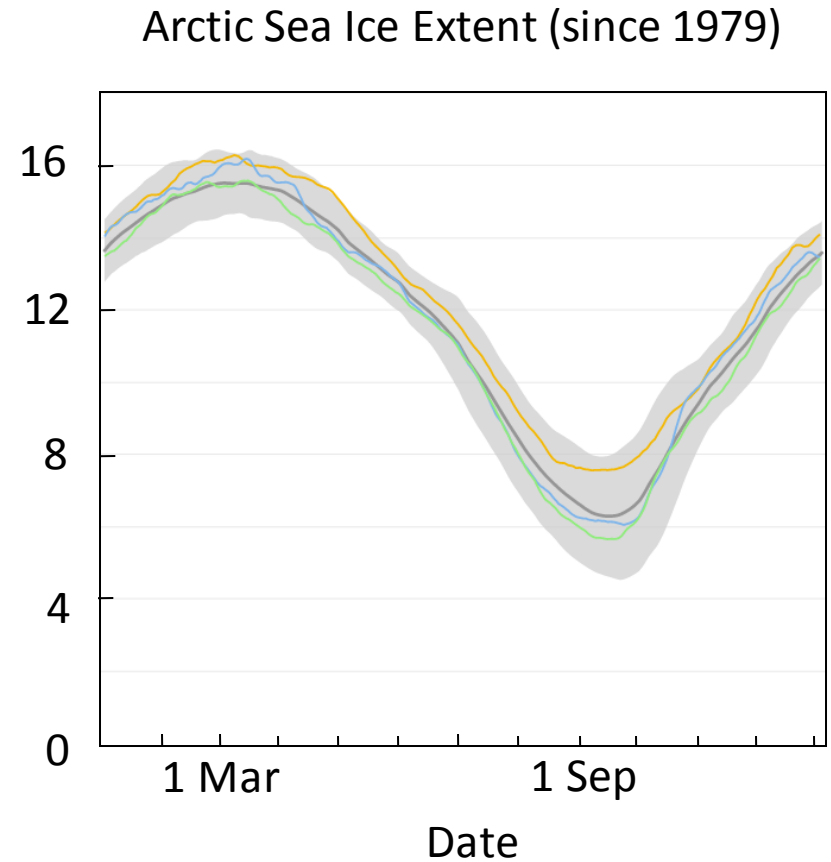
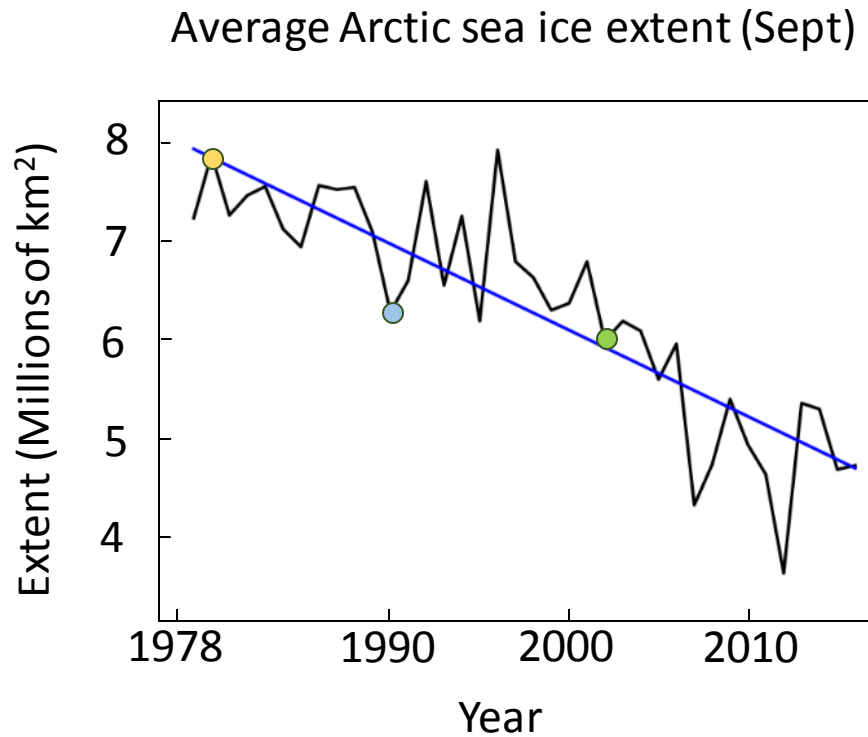
Recent decline in Arctic sea ice extent



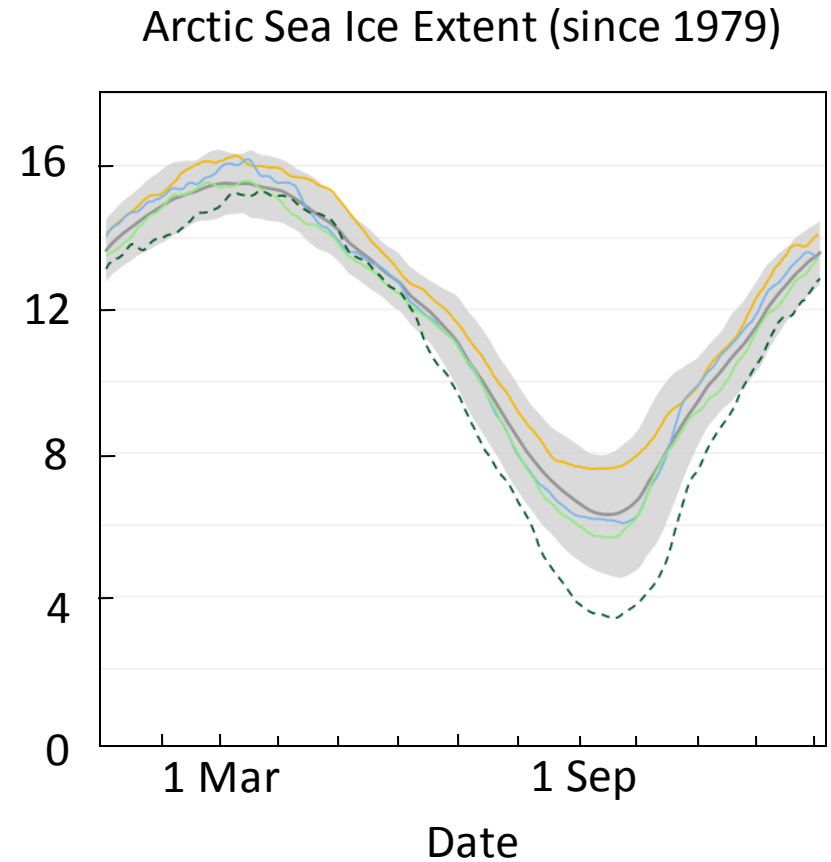
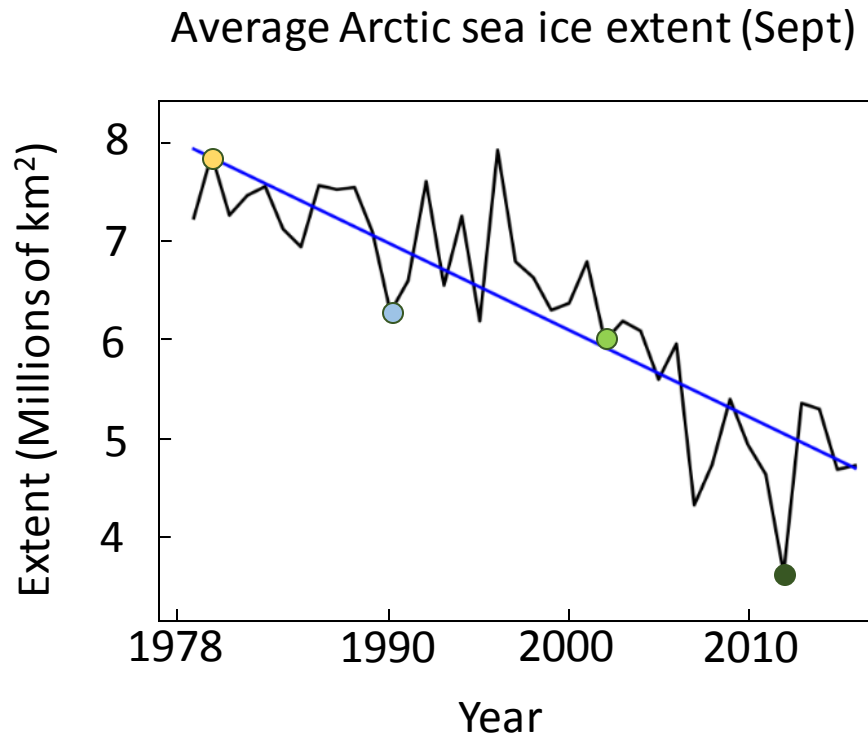
Recent decline in Arctic sea ice extent



Recent decline in Arctic sea ice extent



Recent decline in Arctic sea ice extent



Arctic energy balance model

$$\frac{dE}{dt} = \underbrace{(1 - \alpha(E))F_s(t)}_{\text{incoming}} - \underbrace{(F_l(t) + BT(E, t))}_{\text{outgoing}}$$

Arctic energy balance model

$$\frac{dE}{dt} = \underbrace{(1 - \alpha(E))F_s(t)}_{\text{incoming}} - \underbrace{(F_l(t) + BT(E, t))}_{\text{outgoing}}$$

Major components:

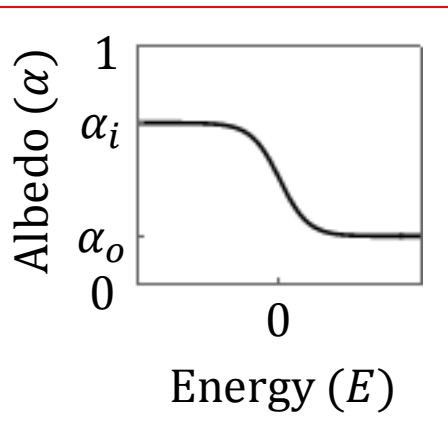
- E has no spatial extent
- Seasonally-varying incoming solar radiation
- Ice-albedo feedback
- State-dependent definition of energy:

$$E \propto \begin{cases} \text{Ocean mixed-layer temperature} & (E > 0) \\ \text{Ice thickness} & (E \leq 0) \end{cases}$$

- Sea ice thermodynamics

Arctic energy balance model

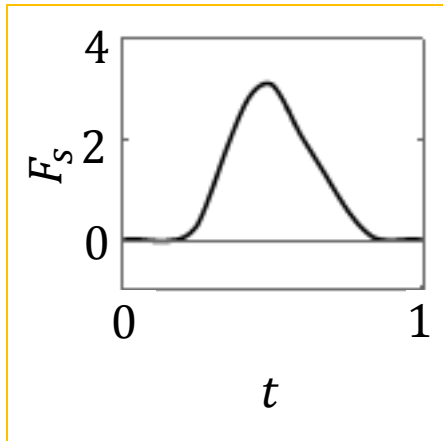
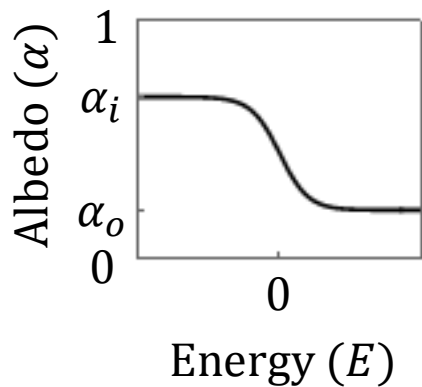
$$\frac{dE}{dt} = (1 - \underbrace{\alpha(E)}_{\text{albedo}})F_S(t) - (F_l(t) + BT(E, t))$$



Arctic energy balance model

$$\frac{dE}{dt} = (1 - \alpha(E)) \underbrace{F_s(t)}_{\substack{\text{incoming} \\ \text{solar} \\ \text{radiation}}} - (F_l(t) + BT(E, t))$$

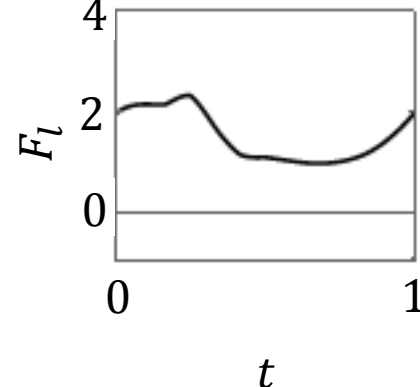
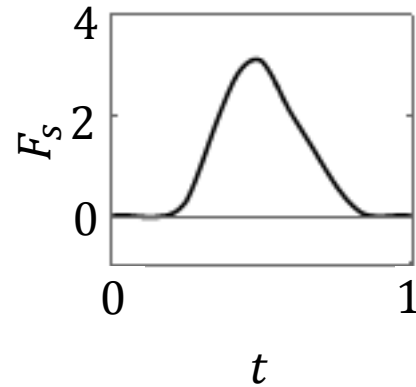
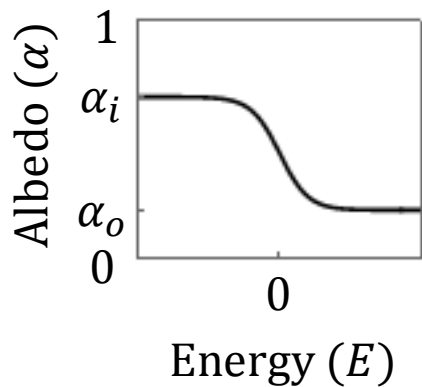
albedo



Arctic energy balance model

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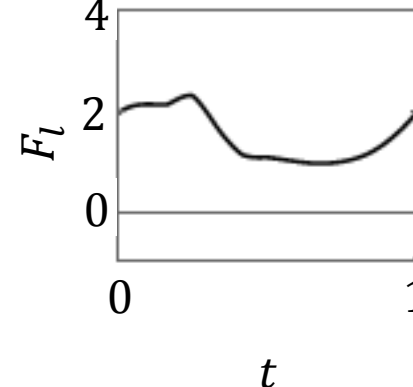
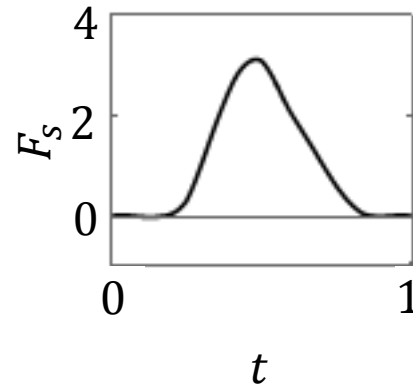
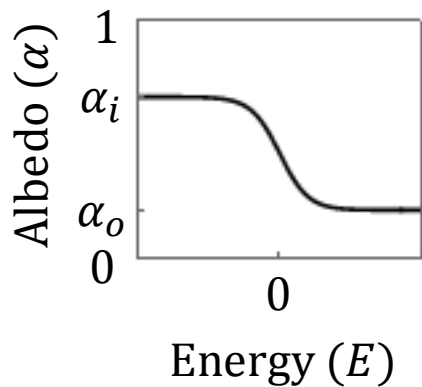
albedo incoming outgoing
solar longwave
radiation radiation



Arctic energy balance model

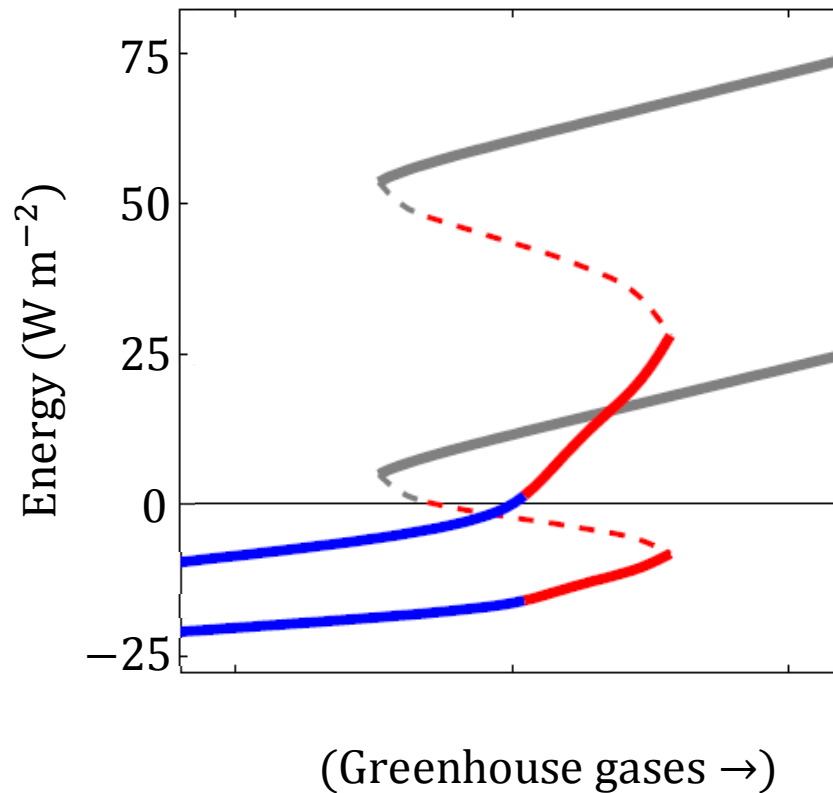
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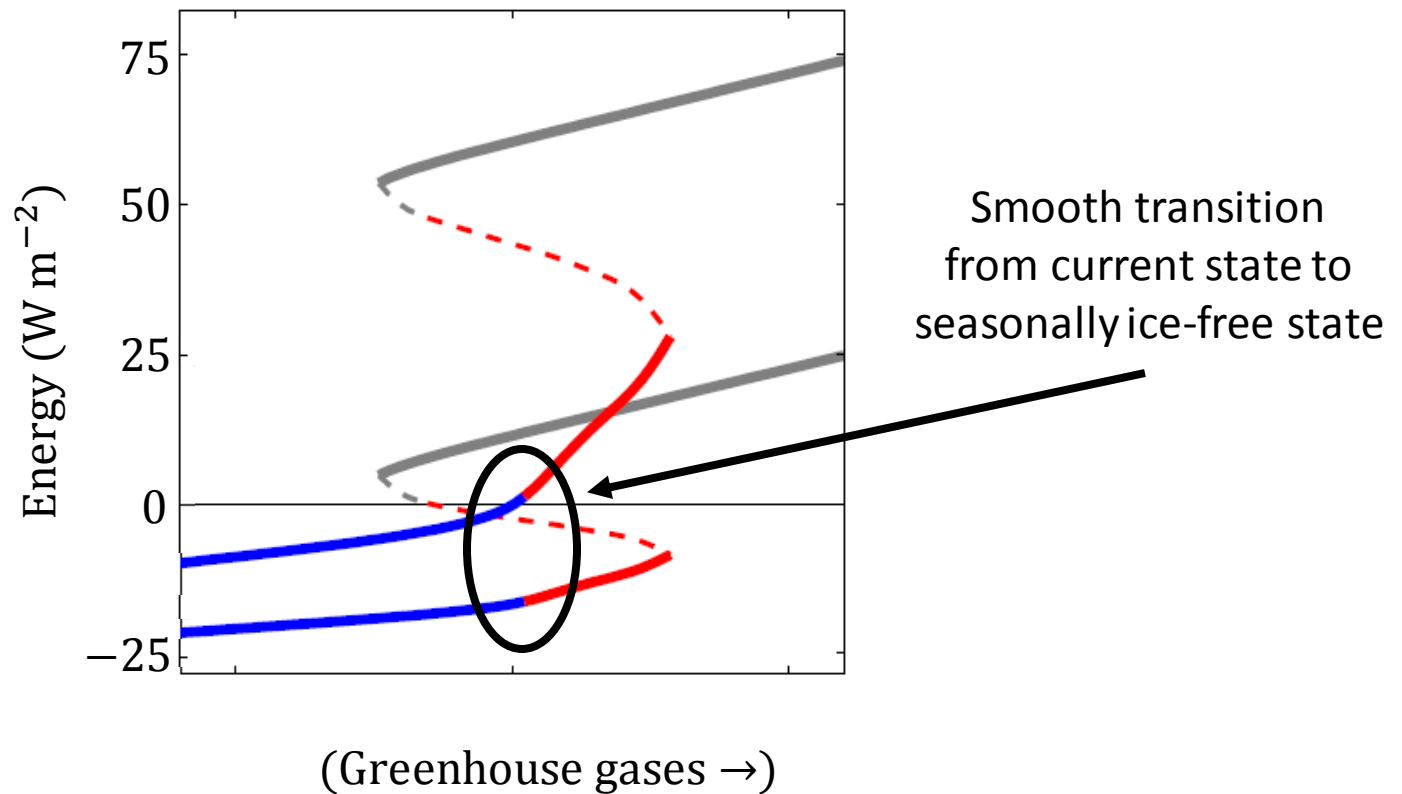
$$T \propto \begin{cases} E & \text{(ocean)} \\ 0 & \text{(melt)} \\ f(t, E) & \text{(ice)} \end{cases}$$

Bifurcation analysis: motivation



- Perennially ice-free
- Seasonally ice-free
- Perennially ice-covered

Bifurcation analysis: motivation

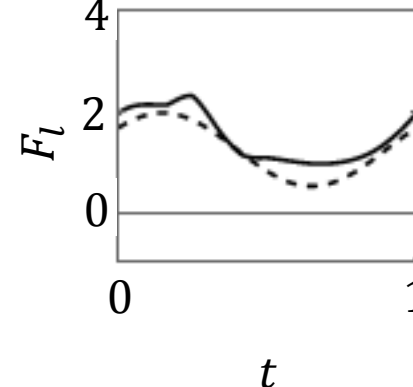
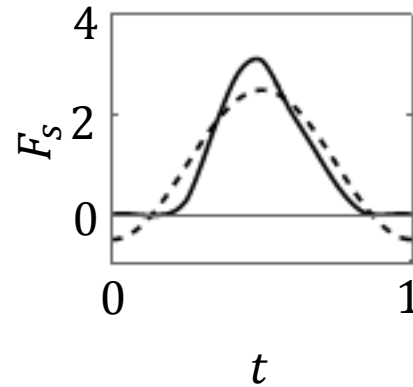
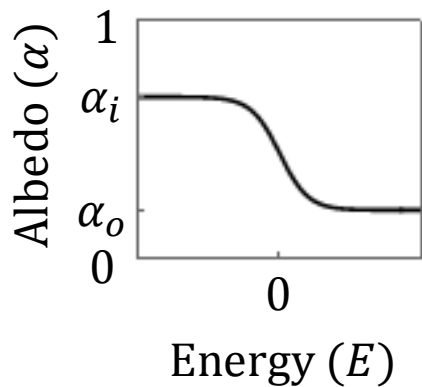


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albedo incoming outgoing temperature
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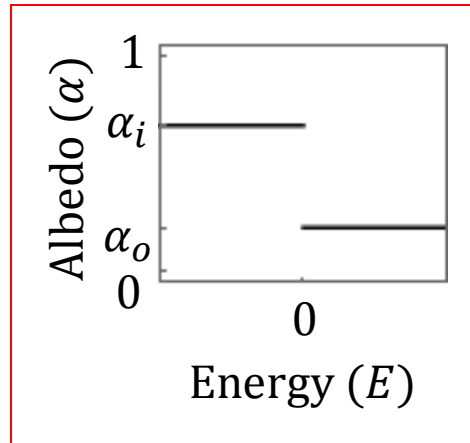
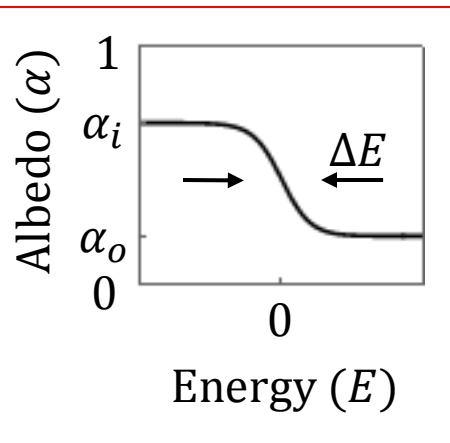


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albedo incoming outgoing temperature
solar longwave
radiation radiation



Solutions in the piecewise-constant albedo limit

We can rewrite our model as:

$$\frac{dE}{dt} = \begin{cases} (1 + \Delta\alpha)F_S(t) - (F_l(t) + BT(E, t)), & E > 0 \\ (1 - \Delta\alpha)F_S(t) - (F_l(t) + BT(E, t)), & E < 0 \end{cases}$$

$$= \begin{cases} F_+(t) - BT(E, t), & E > 0 \\ F_-(t) - BT(E, t), & E < 0 \end{cases}$$

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$$= \begin{cases} F_+ - BE, & E \geq 0 & \text{[no ice]} \\ F_-, & E < 0, F_- > 0 & \text{[ice melting]} \\ \frac{\zeta F_-}{\zeta - E}, & E < 0, F_- < 0 & \text{[ice growing]} \end{cases}$$

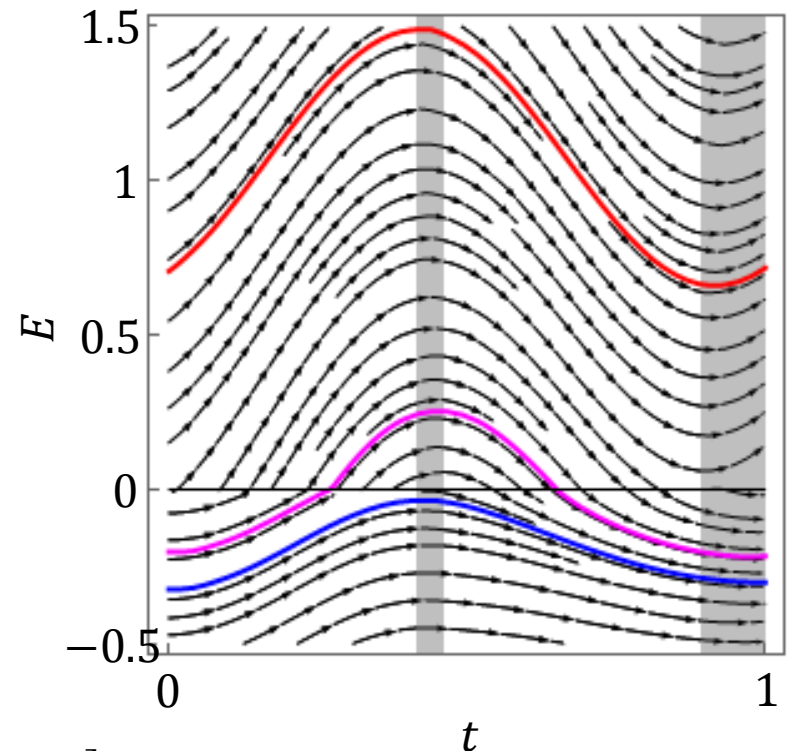
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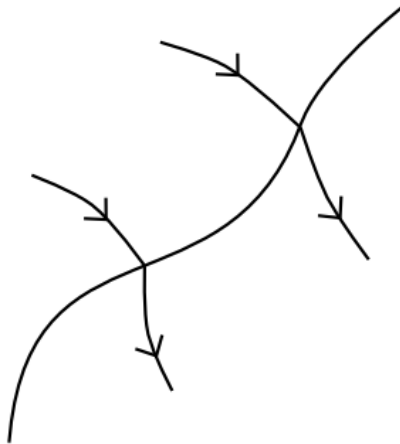
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Piecewise-smooth dynamical systems

No sliding



Attracting Sliding

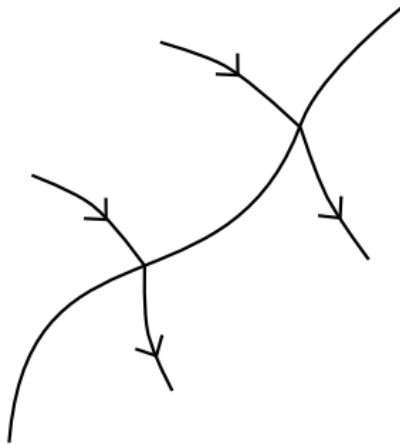


Repelling sliding

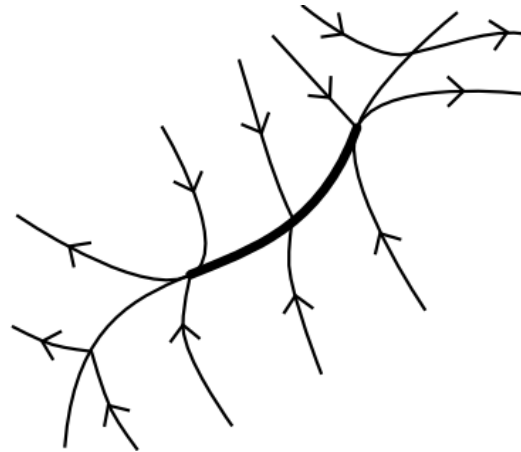


Piecewise-smooth dynamical systems

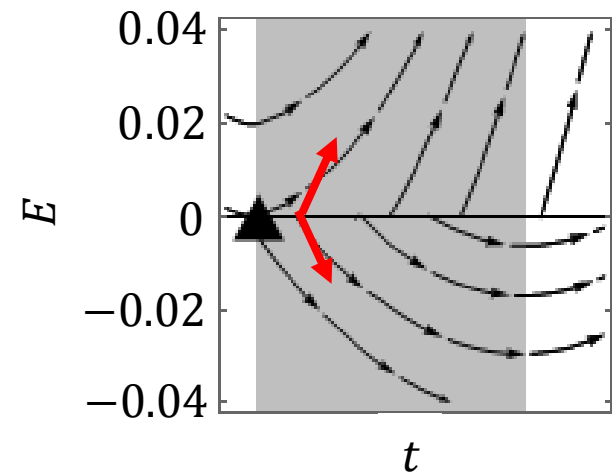
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Attracting Sliding



Repelling sliding



Repelling sliding intervals

Repelling sliding intervals

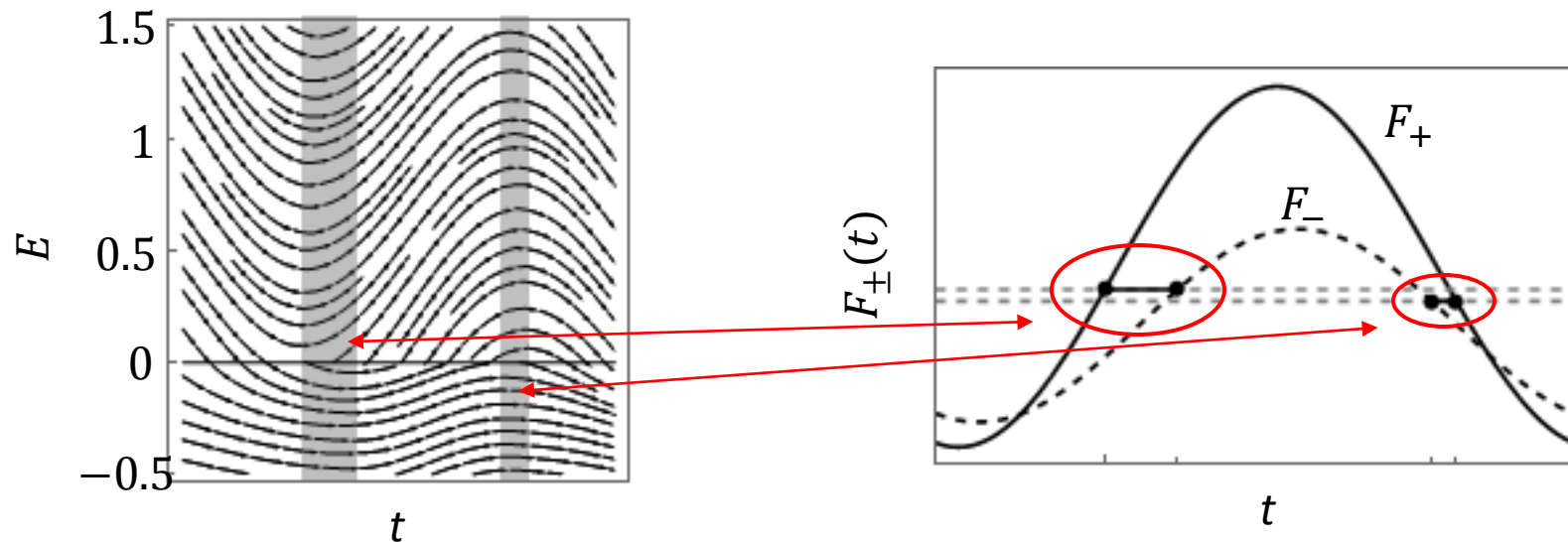
1. Width determined by F_{\pm} :

$$\frac{dE}{dt} = \begin{cases} F_+(t) - BT(E, t), & E > 0 \\ F_-(t) - BT(E, t), & E < 0 \end{cases}$$

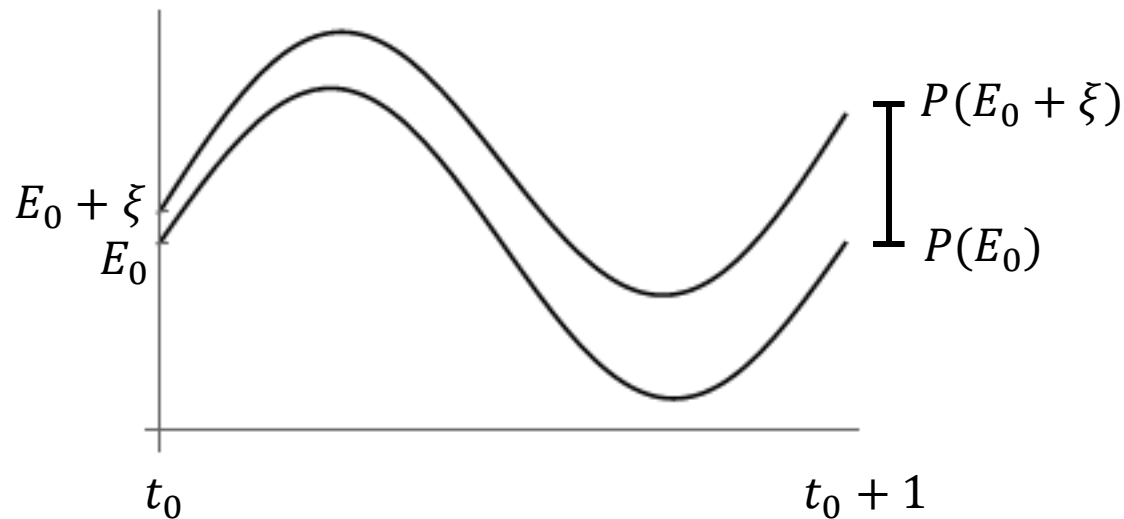
2. Affect stability of solutions
3. Introduce non-uniqueness

1. Sliding interval width

$$\frac{dE}{dt} = \begin{cases} F_+(t) - BT(E, t), & E > 0 \\ F_-(t) - BT(E, t), & E < 0 \end{cases}$$

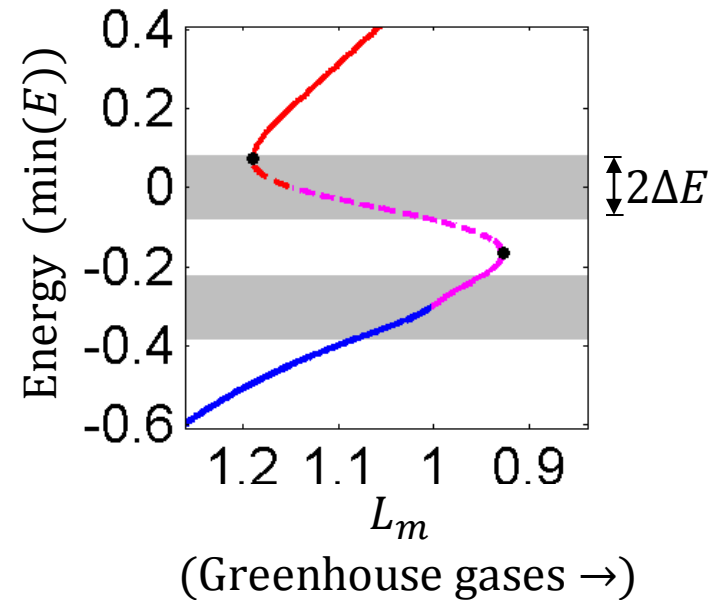


2. Stability: Floquet multiplier



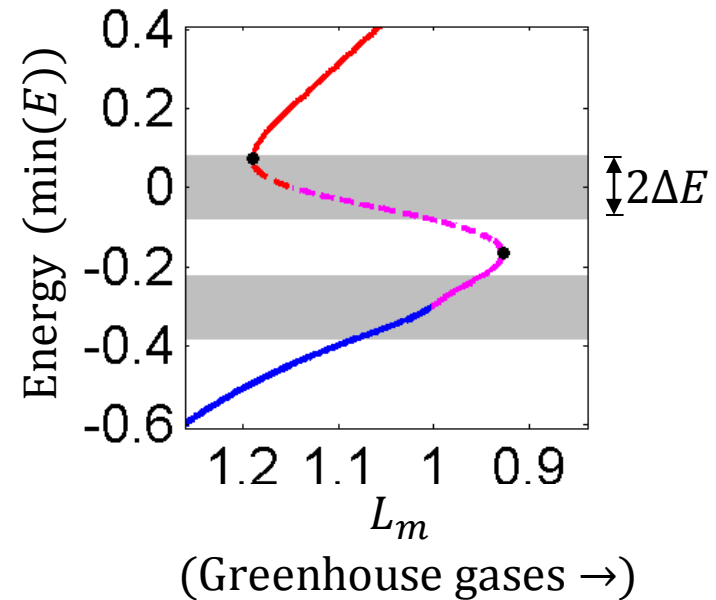
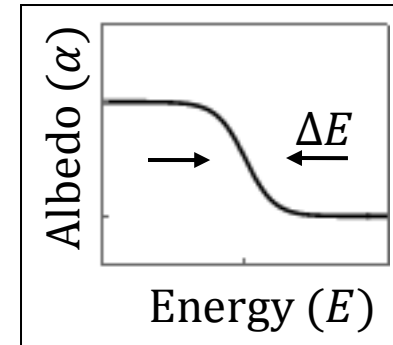
$$\begin{aligned} \text{Floquet Multiplier} &= \frac{P(E_0 + \xi) - P(E_0)}{\xi} \\ &= \exp\left(\int_{t_0}^{t_0+1} \frac{\partial f}{\partial E}(\tau, E) d\tau\right) \end{aligned}$$

2. Stability: Floquet multiplier



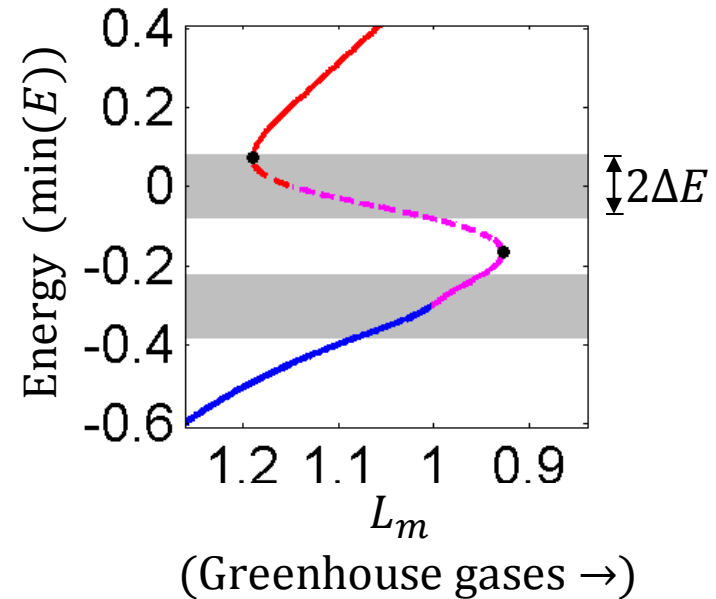
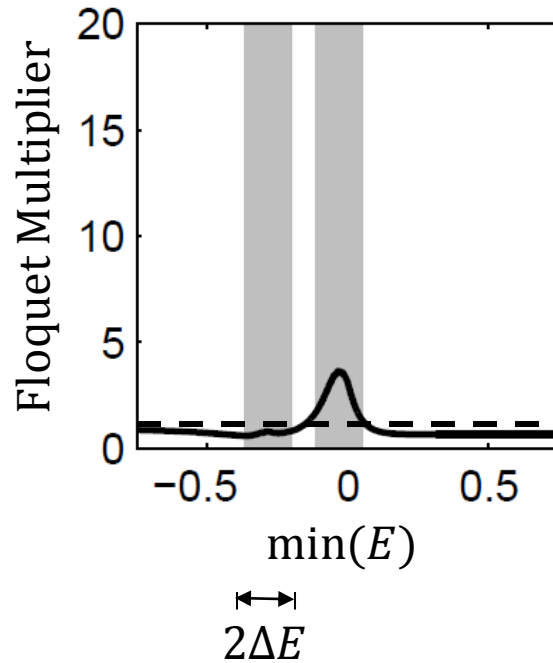
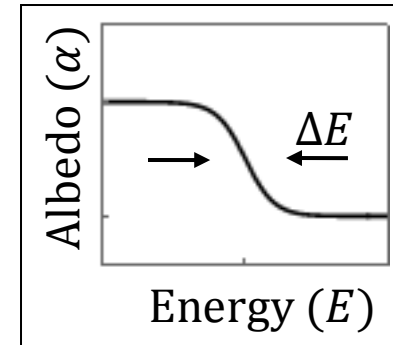
- Perennially ice-free
- Seasonally ice-free
- Perennially ice-covered

2. Stability: Floquet multiplier



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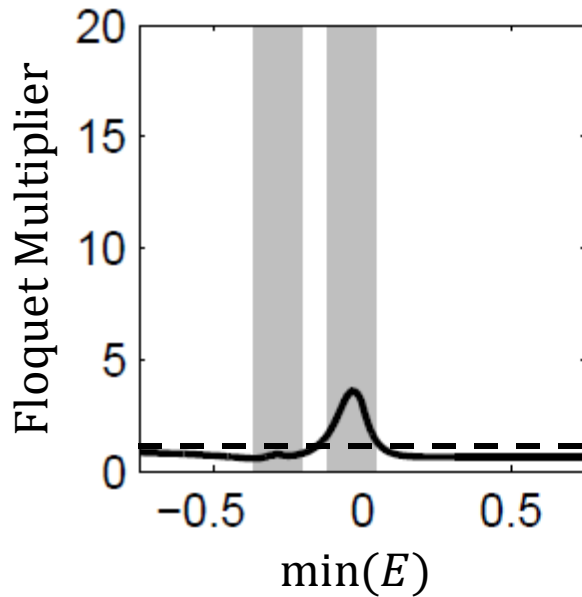
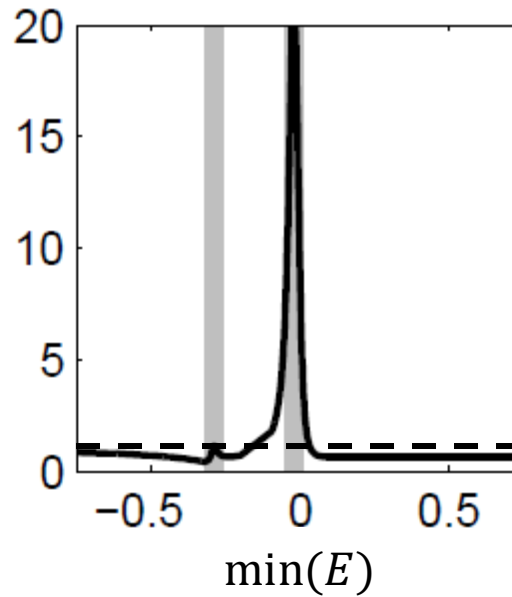
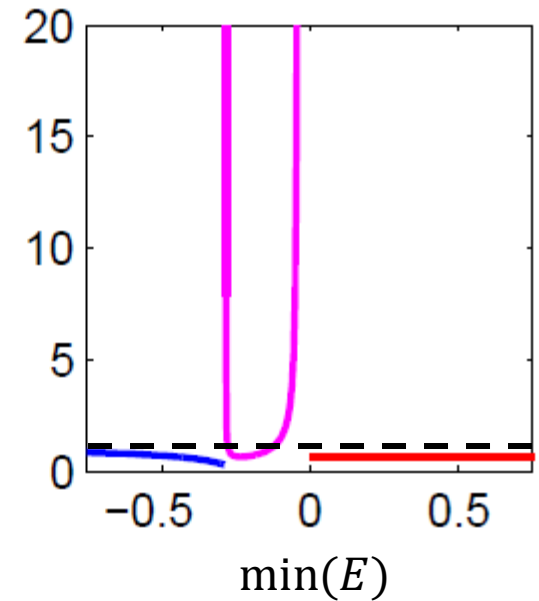
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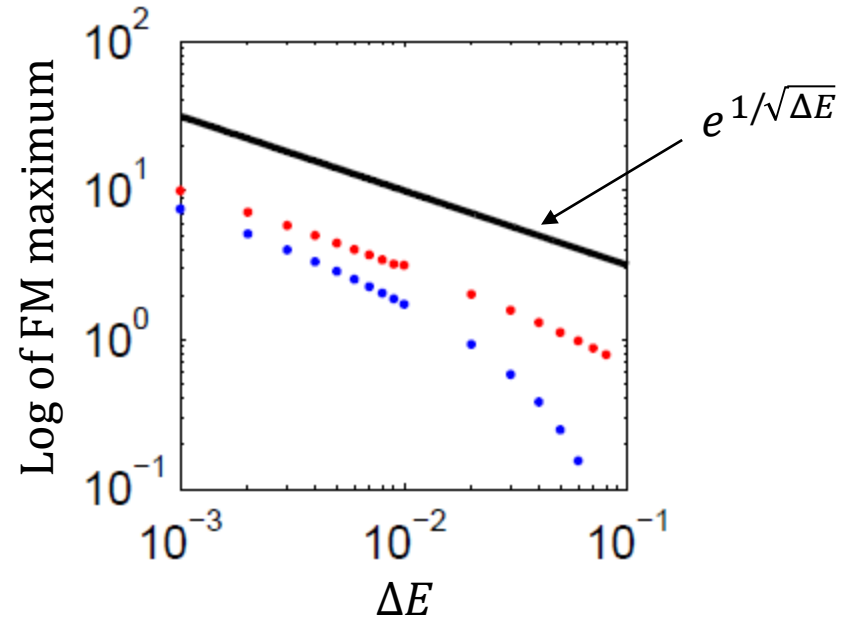
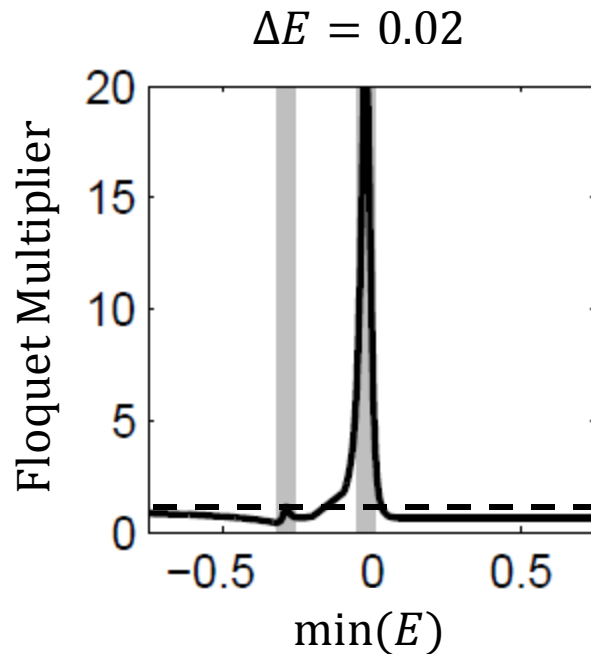
(Greenhouse gases \rightarrow)

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2. Stability: Floquet multiplier

 $\Delta E = 0.08$  $\Delta E = 0.02$  $\Delta E \rightarrow 0$ 

2. Stability: Floquet multiplier



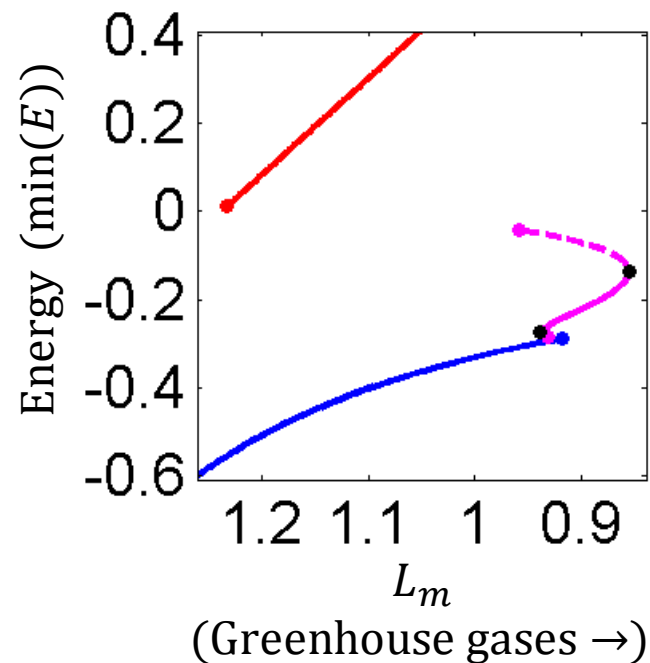
Maxima seem to increase like $e^{k/\sqrt{\Delta E}}$

Using Filippov solutions ($\Delta E = 0$) to approximate the Floquet multiplier:

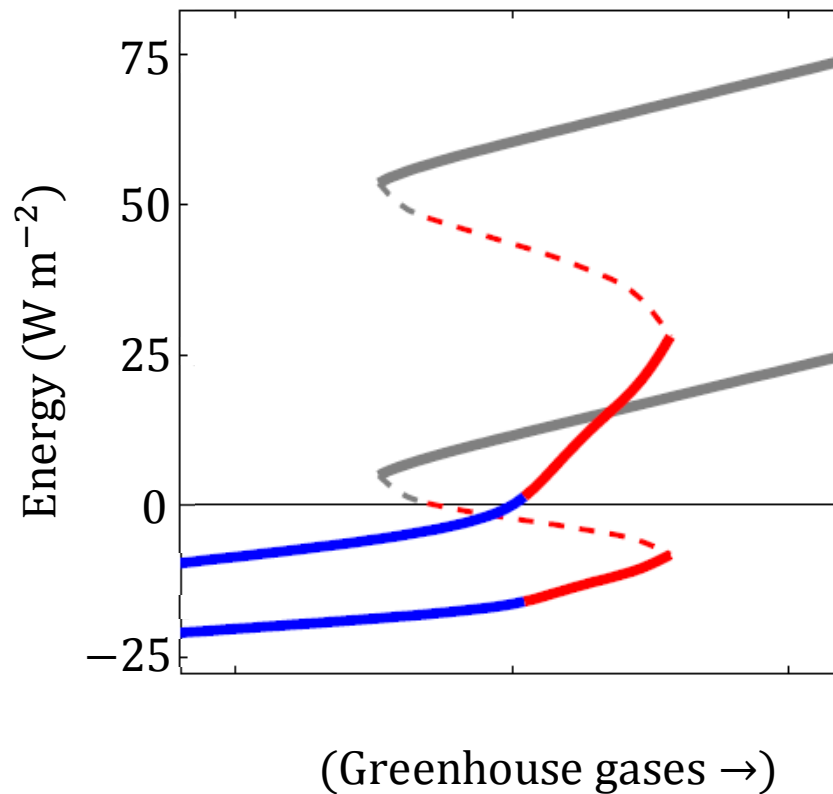
$$\exp\left(\int_{t_0}^{t_0+1} \frac{\partial f}{\partial E}(\tau, E) d\tau\right)$$

3. Non-unique solutions

- Omit non-unique periodic solutions from bifurcation diagram
- Leads to bifurcation diagram with 'gaps'
- Grazing-sliding bifurcations

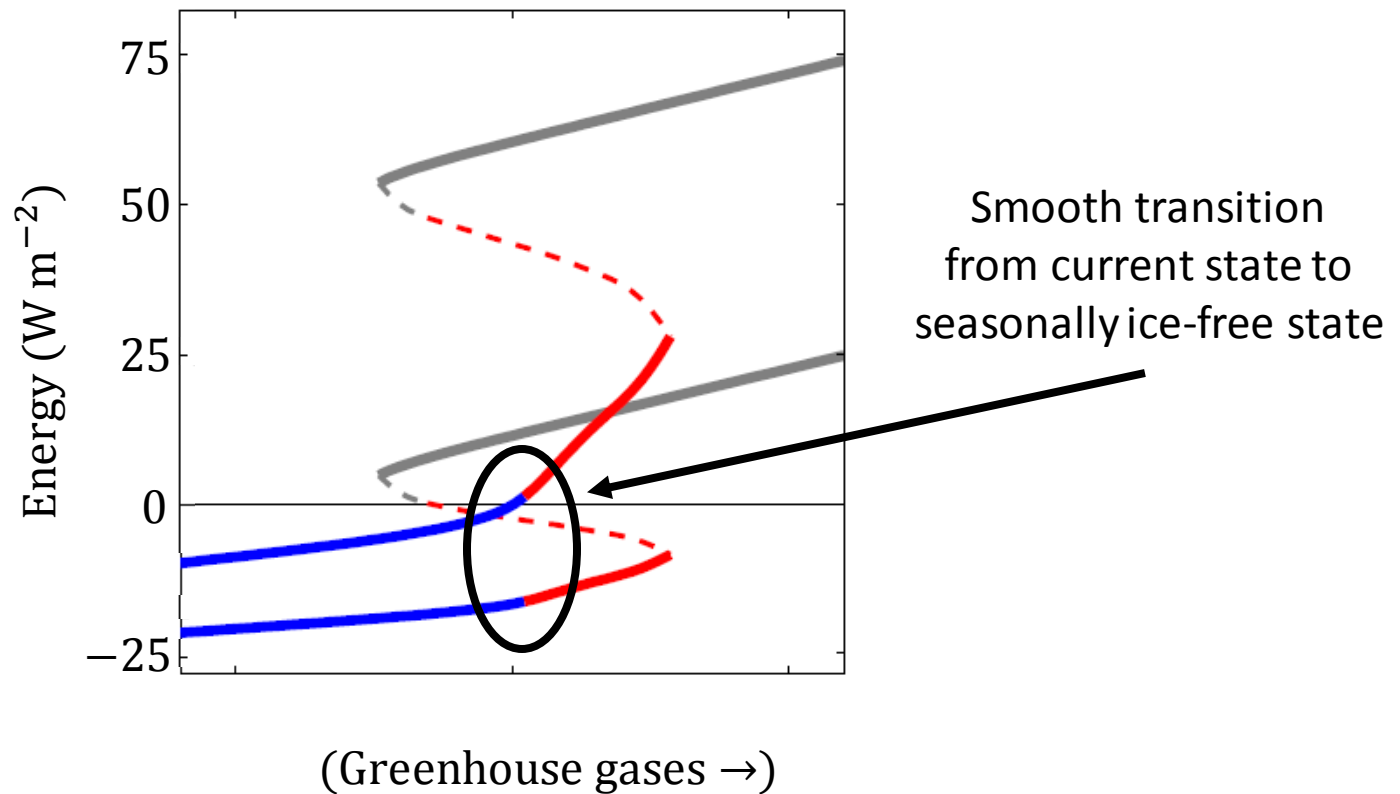


Bifurcation analysis: motivation

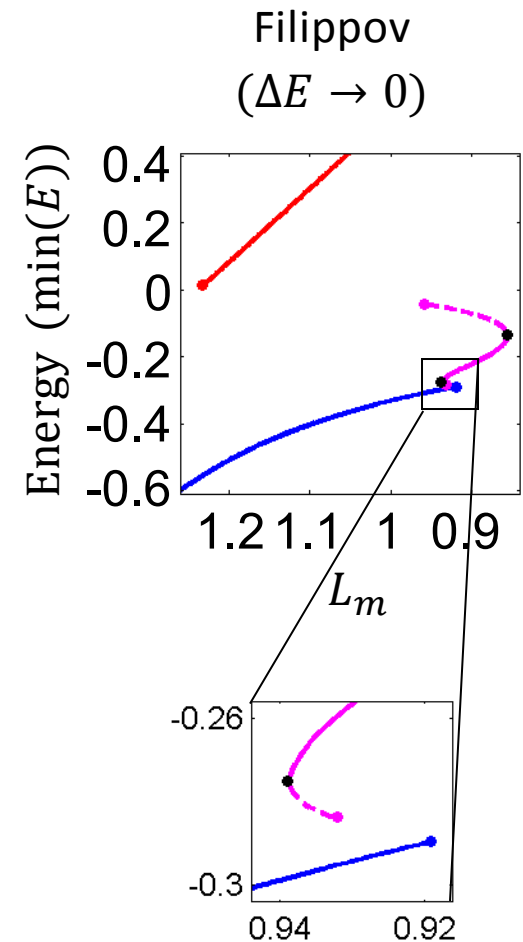
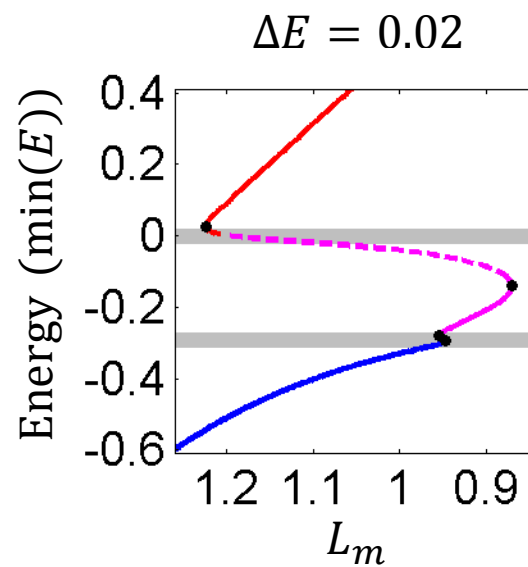
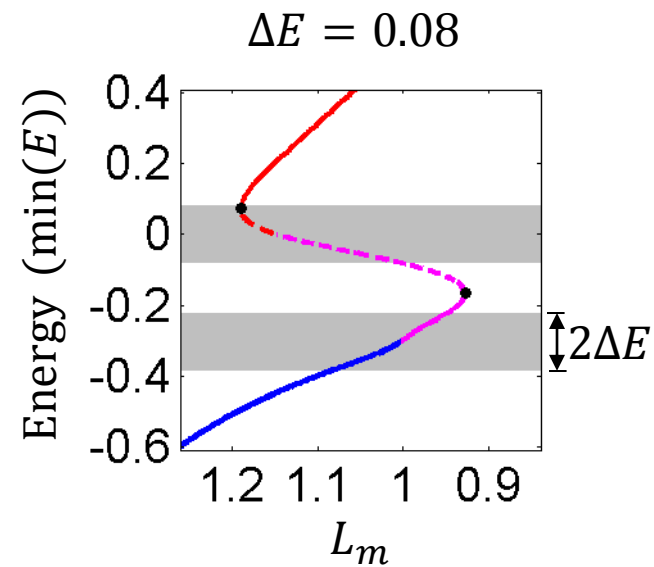


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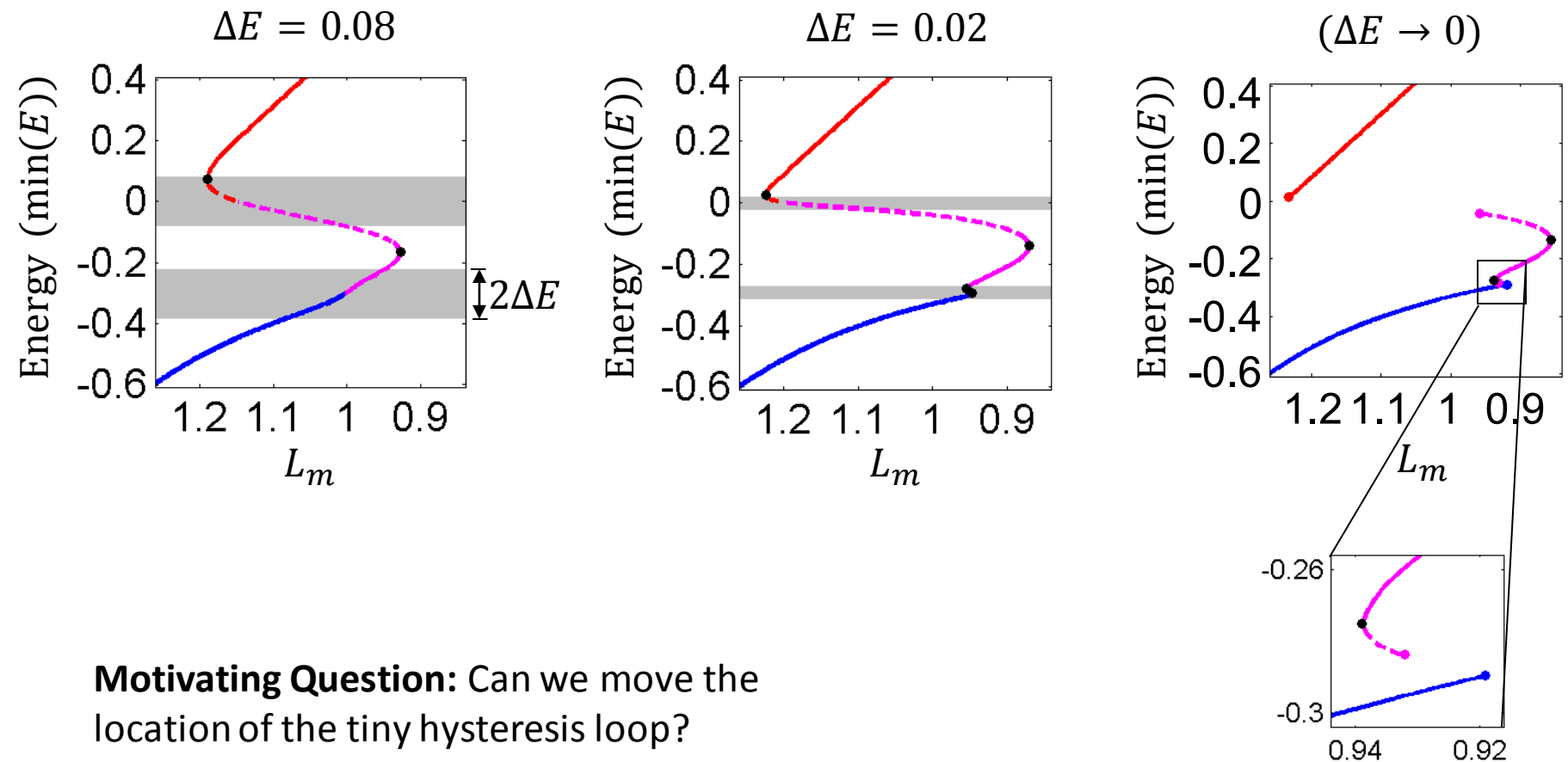
Bifurcation analysis: motivation



Comparing piecewise-smooth to Filippov



Comparing piecewise-smooth to Filippov

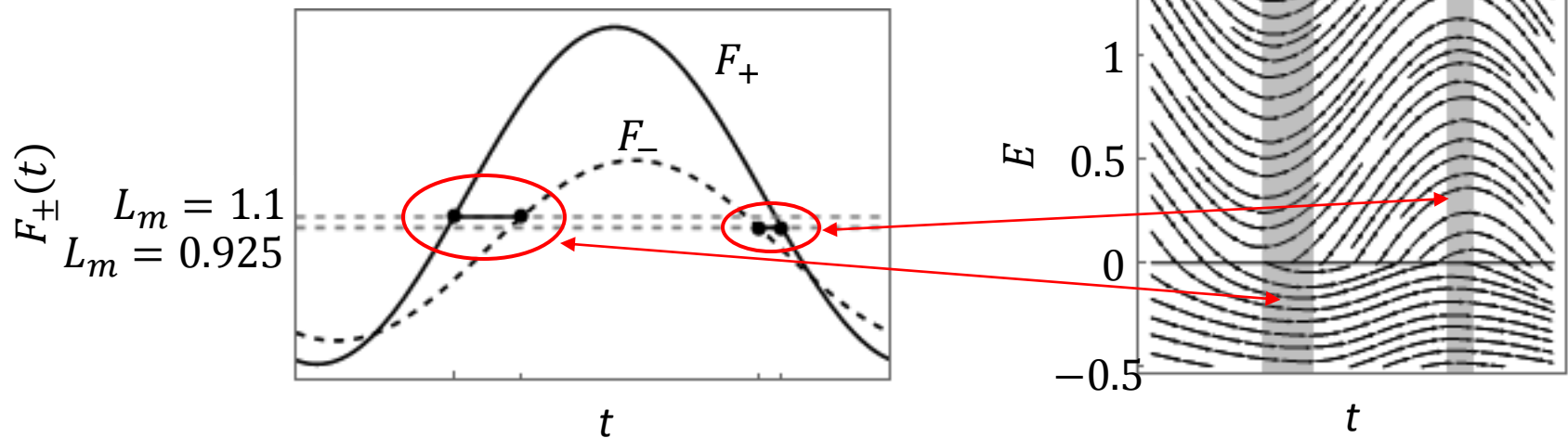


Motivating Question: Can we move the location of the tiny hysteresis loop?

Relationship between sliding intervals and gap size

Sliding width comes from F_{\pm} :

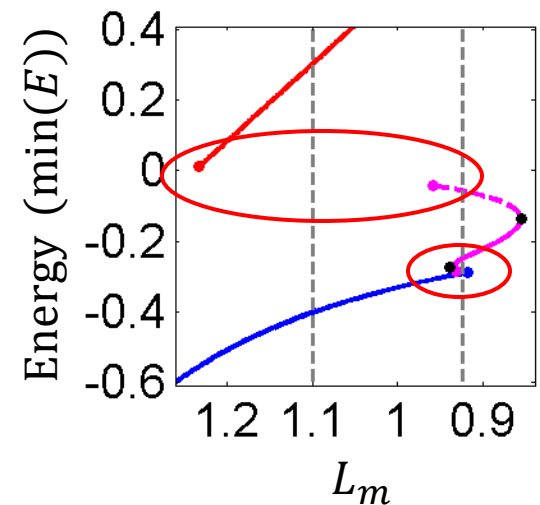
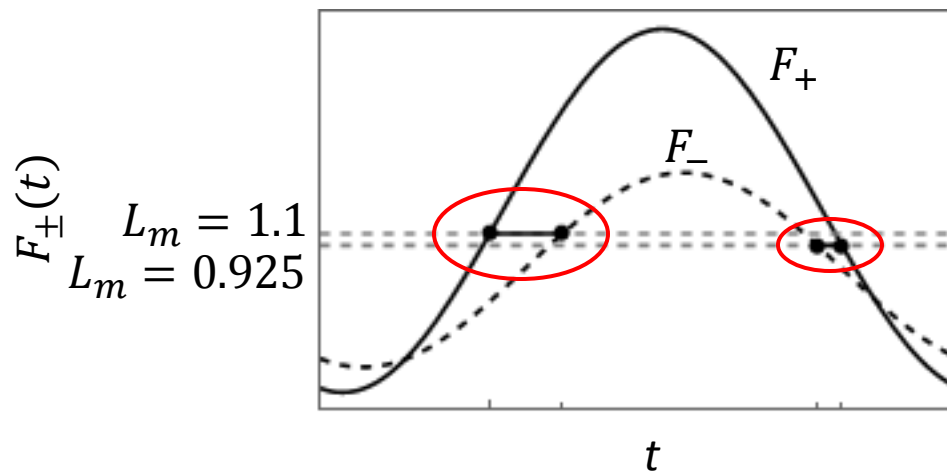
$$\frac{dE}{dt} = \begin{cases} F_+(t) - BT(E, t), & E > 0 \\ F_-(t) - BT(E, t), & E < 0 \end{cases}$$



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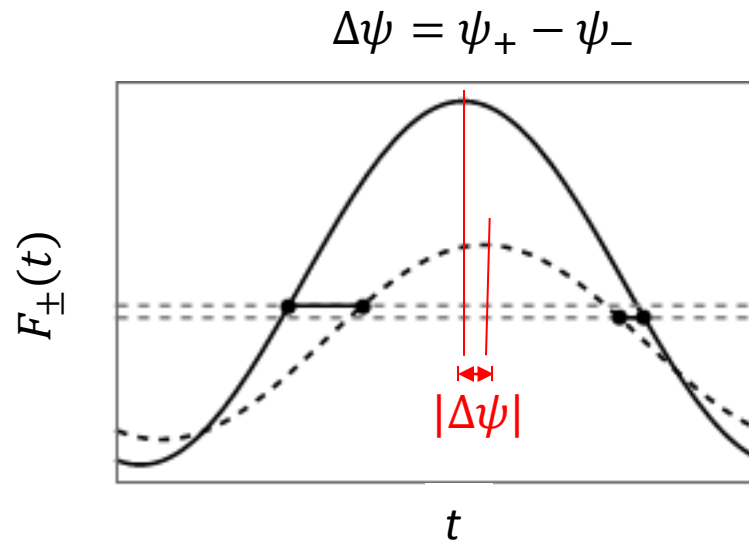


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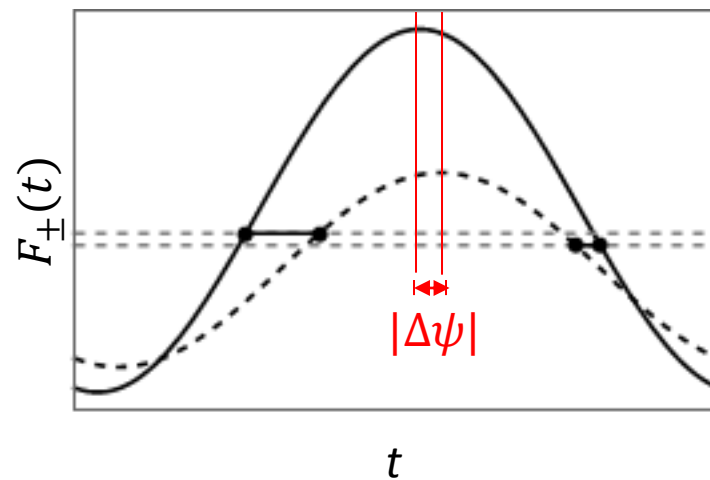
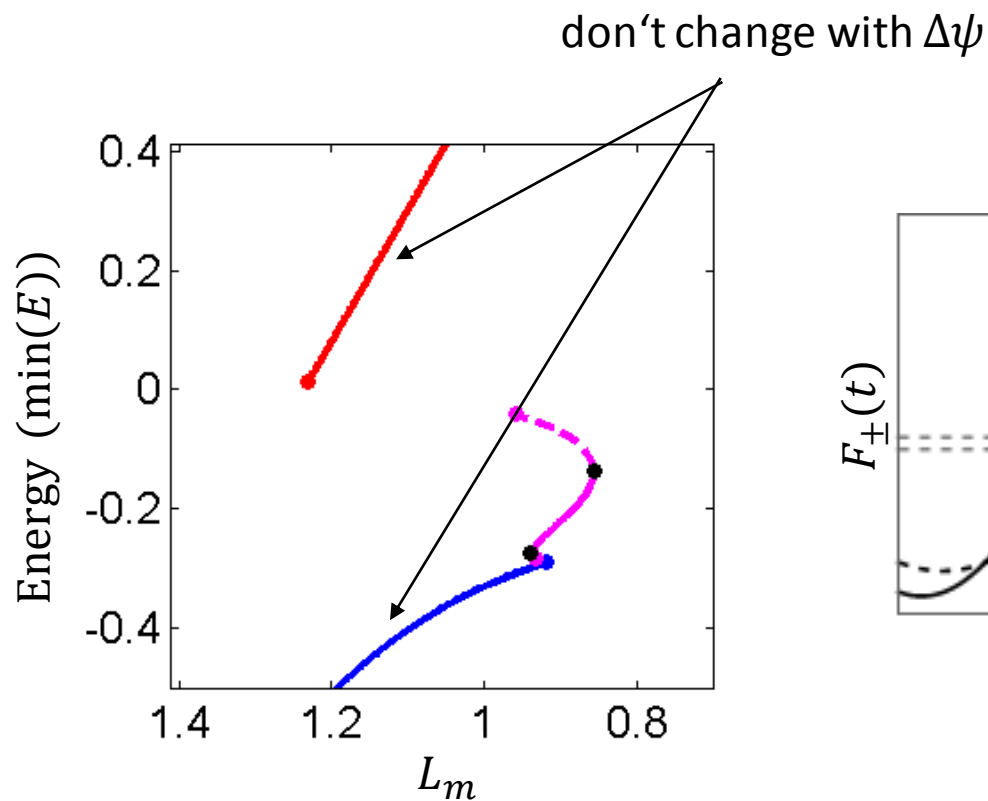
Map F_{\pm} to a standard form:

$$F_{\pm} = (1 \pm \Delta_{\alpha})(1 - S_{\alpha} \cos 2\pi t) - (L_m + L_{\alpha} \cos 2\pi(t - \phi))$$

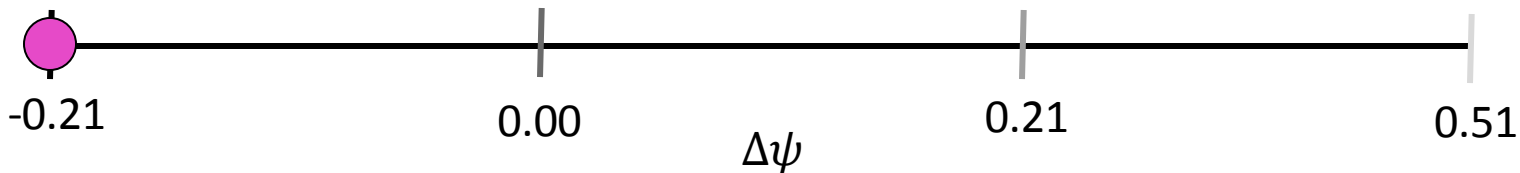
$$\longrightarrow F_{\pm} = \overline{F}_{\pm} + \widetilde{F}_{\pm} \cos(2\pi t - \psi_{\pm})$$



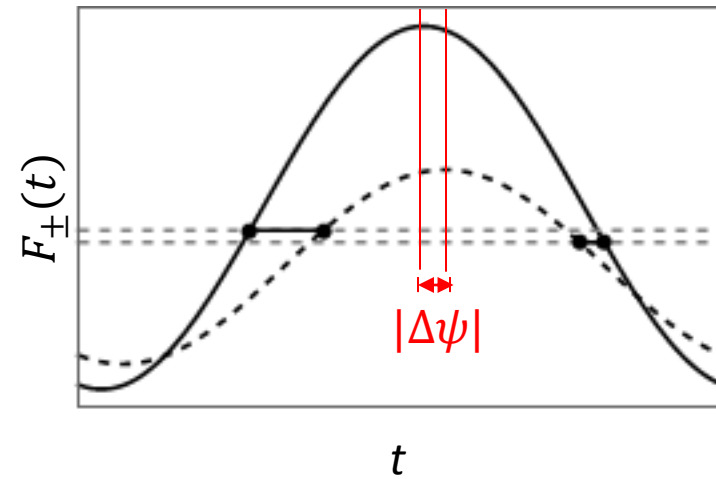
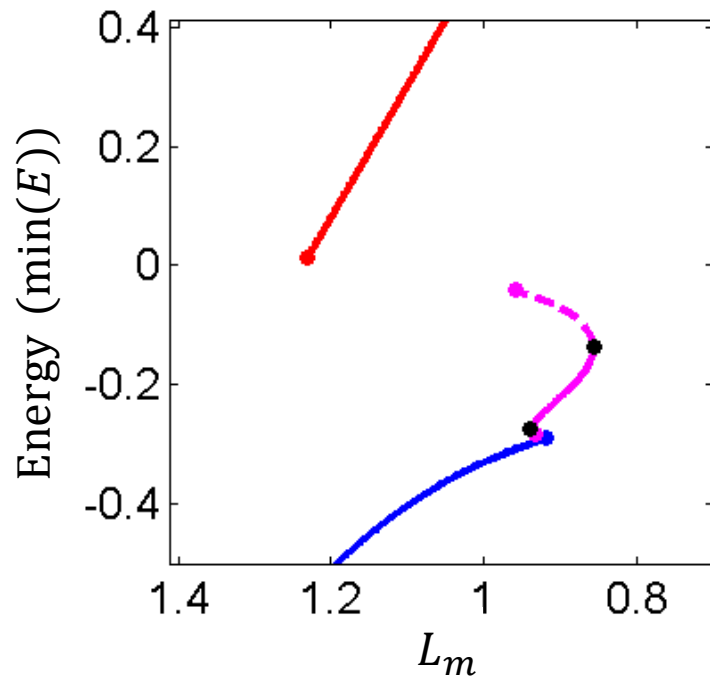
Varying $\Delta\psi$



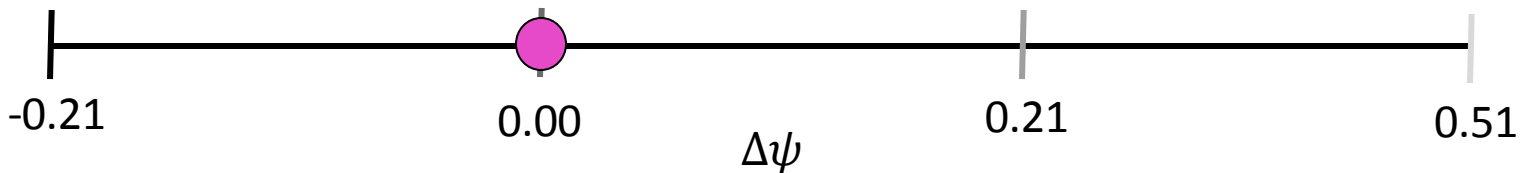
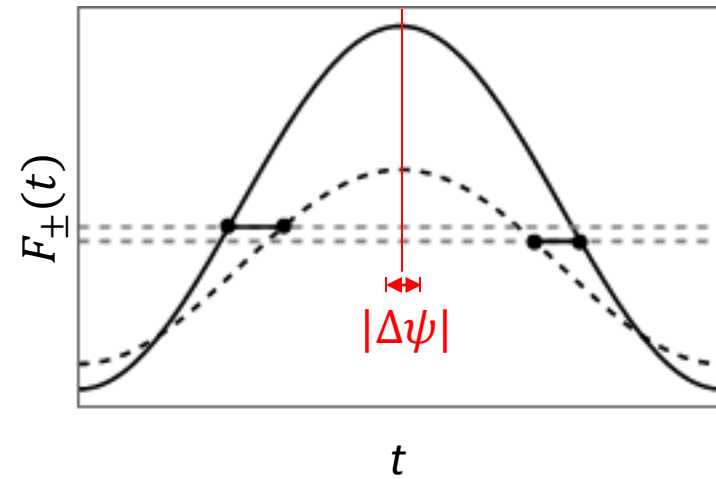
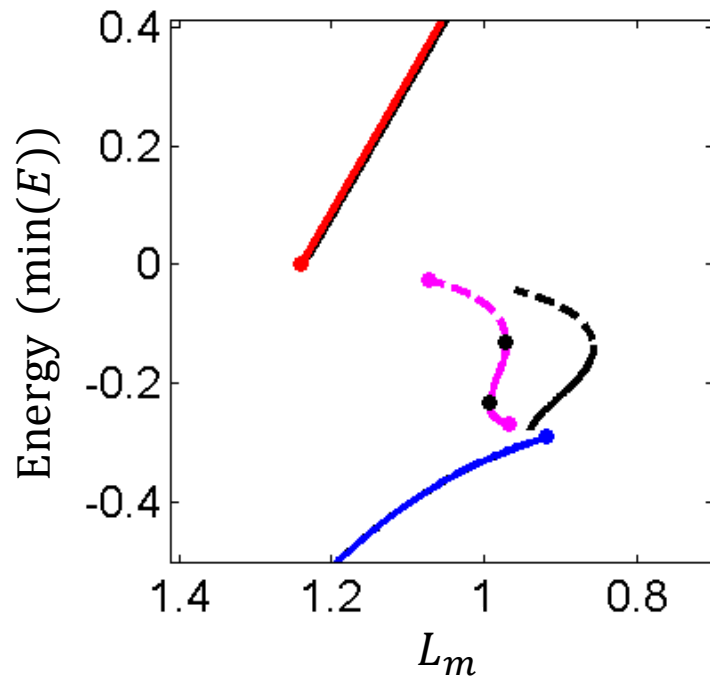
(Default value)



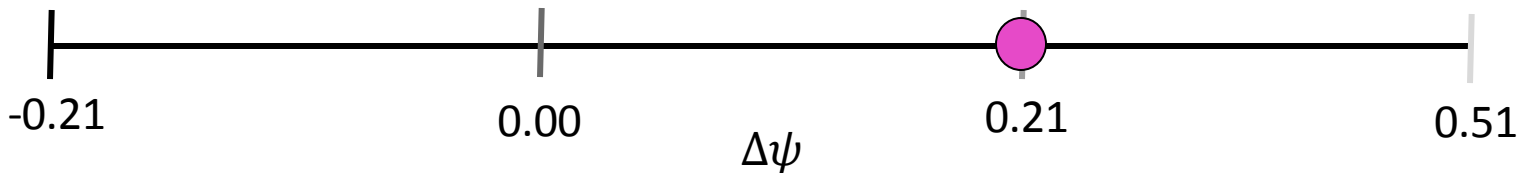
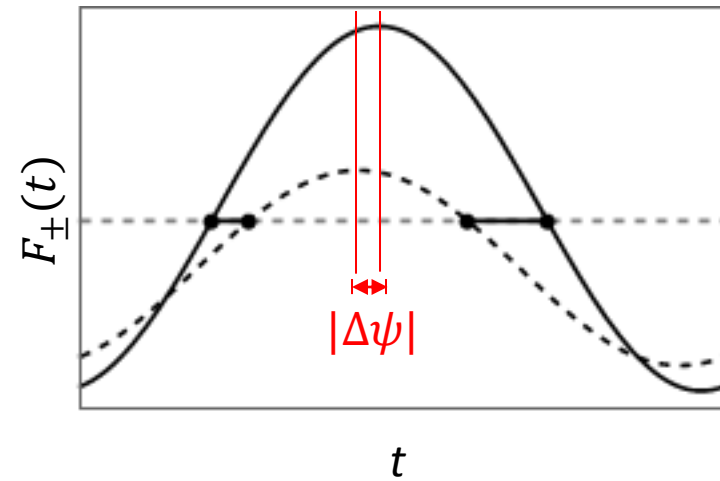
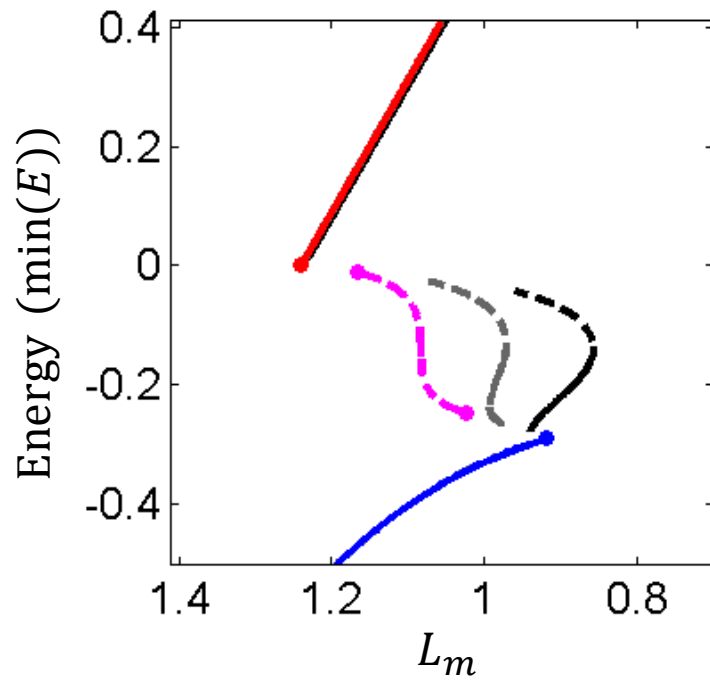
Varying $\Delta\psi$



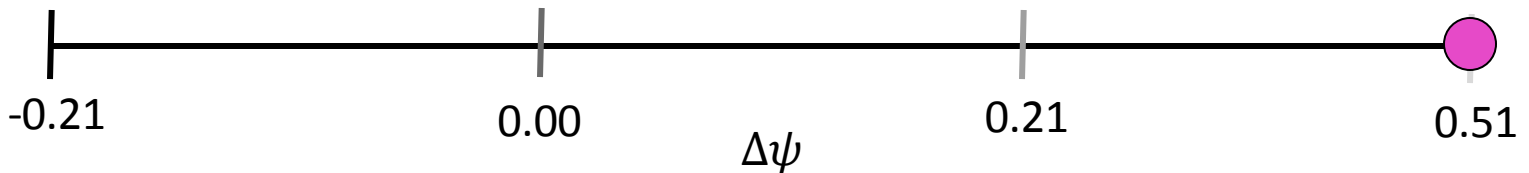
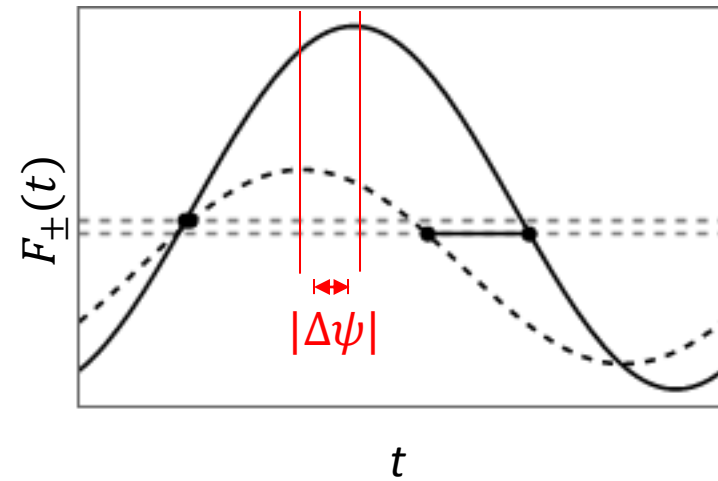
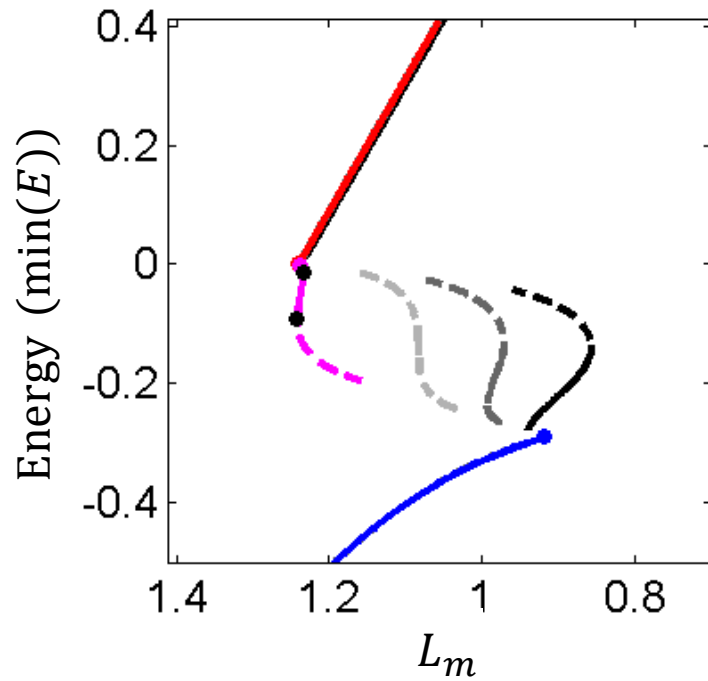
Varying $\Delta\psi$



Varying $\Delta\psi$

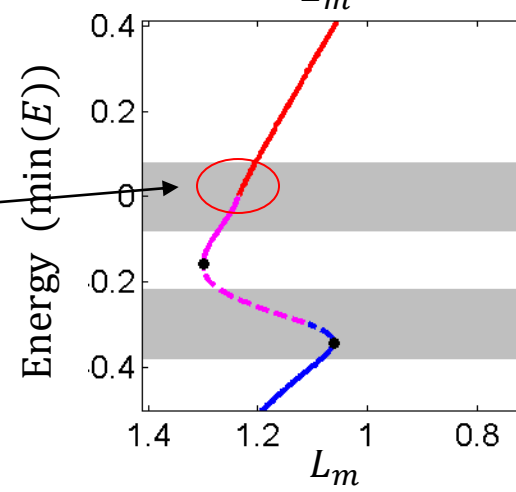
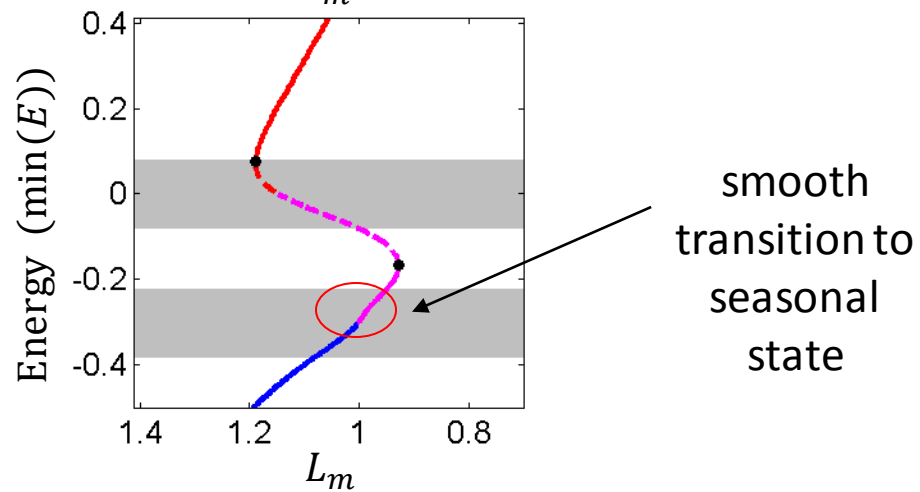
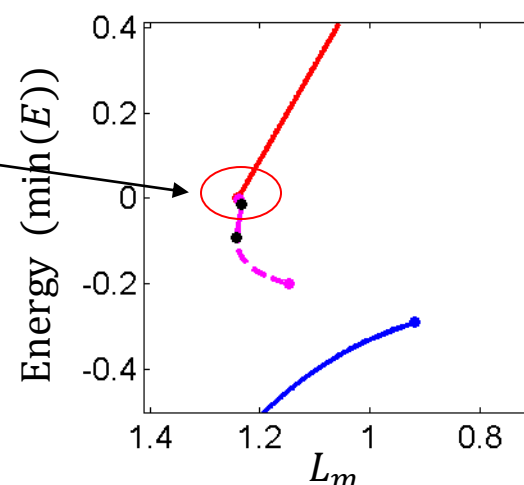
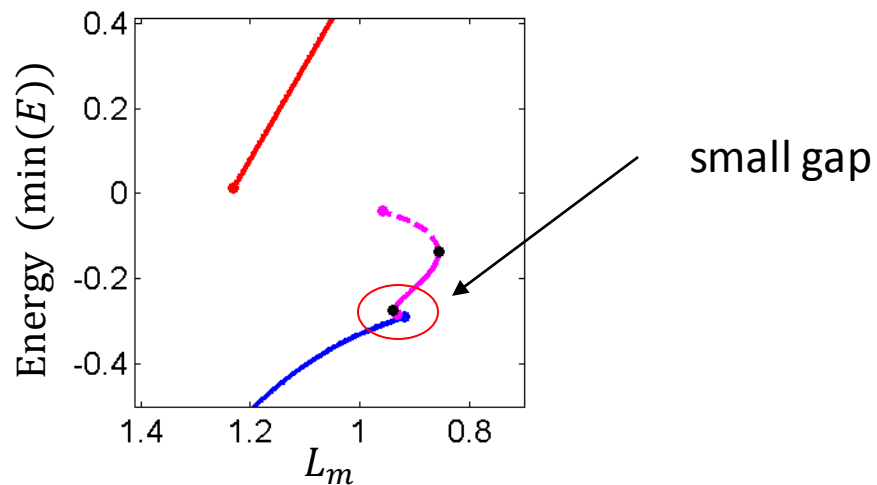
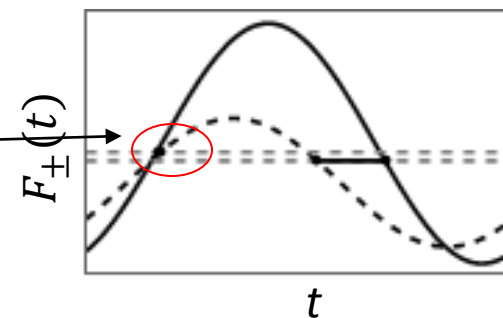
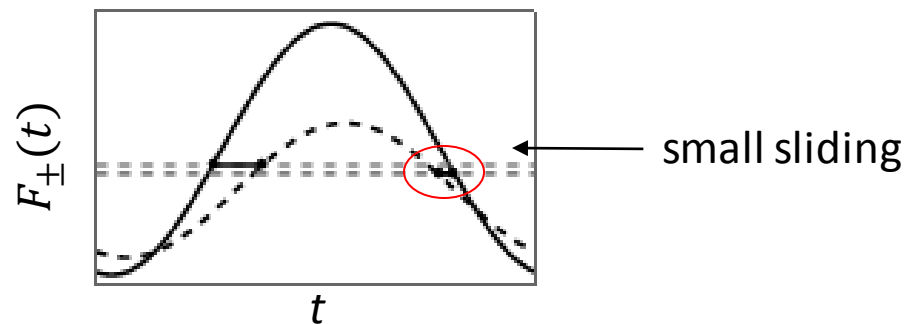


Varying $\Delta\psi$

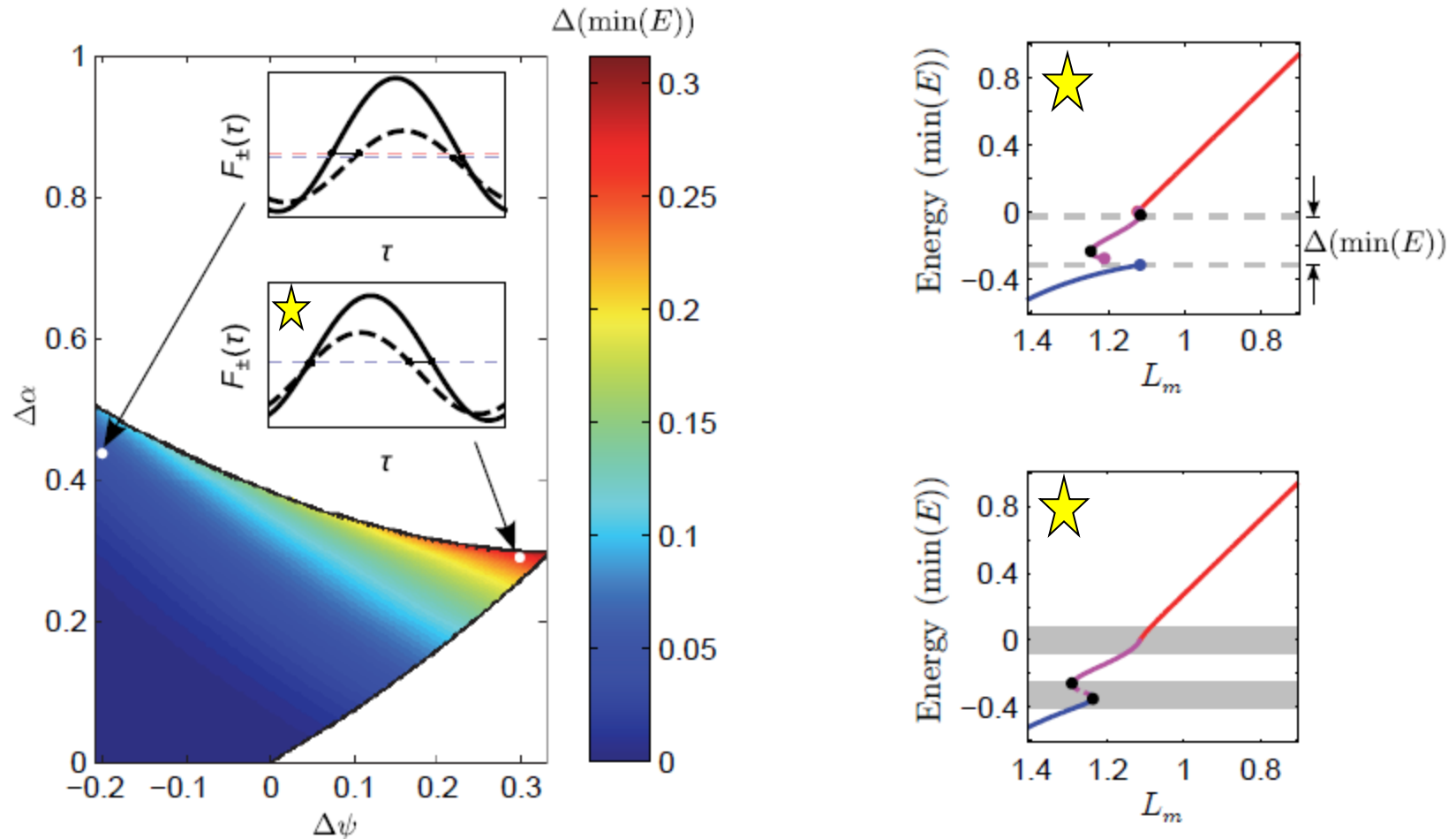


$\Delta\psi = -0.21$ (Original parameters)

$\Delta\psi = 0.51$



Size of the jump: $\Delta(\min(E))$



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Mary Silber
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Dorian Abbot
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