

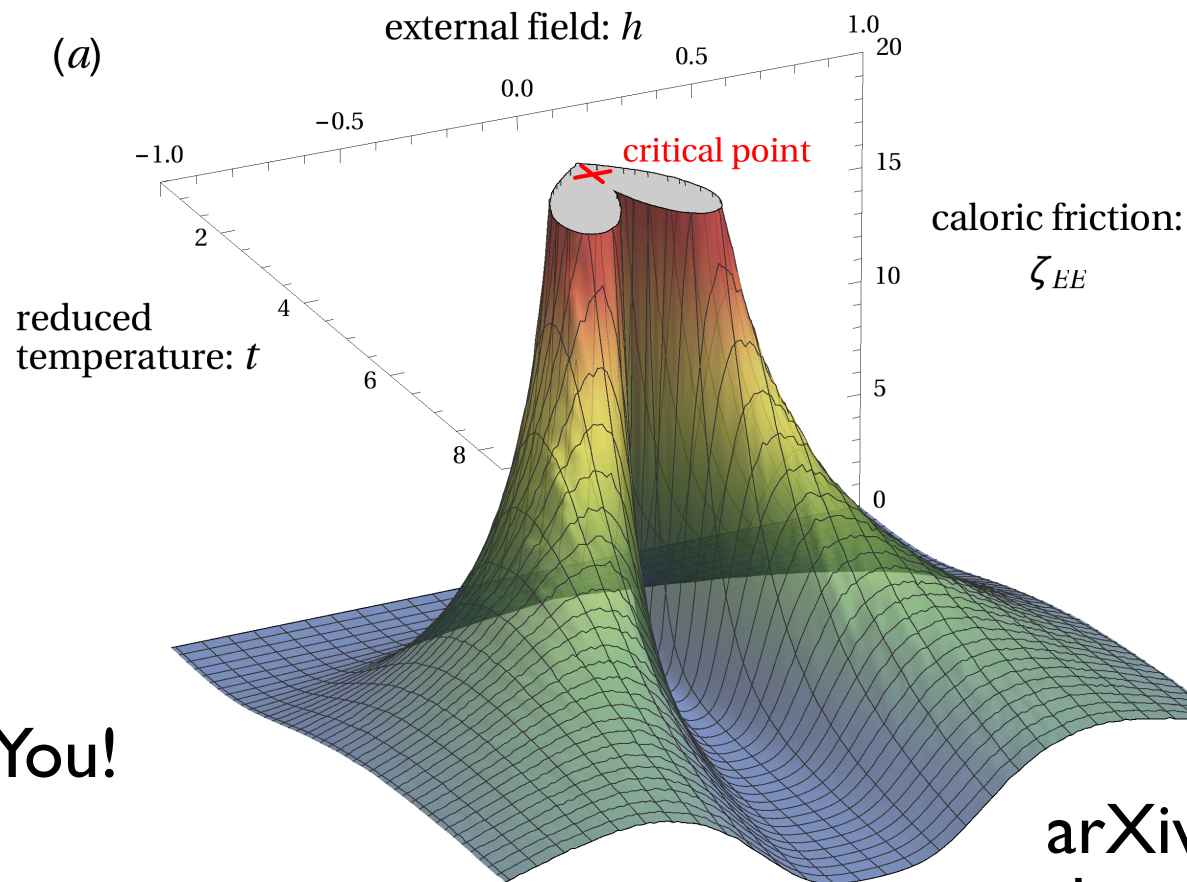


Forward Through Backwards Time by RocketBoom

Optimal Thermodynamic Control and the Dynamic Riemannian Geometry of Ising magnets

Gavin Crooks

Lawrence Berkeley National Lab



Funding:
Citizens Like You!
ARO
NSF, DOE

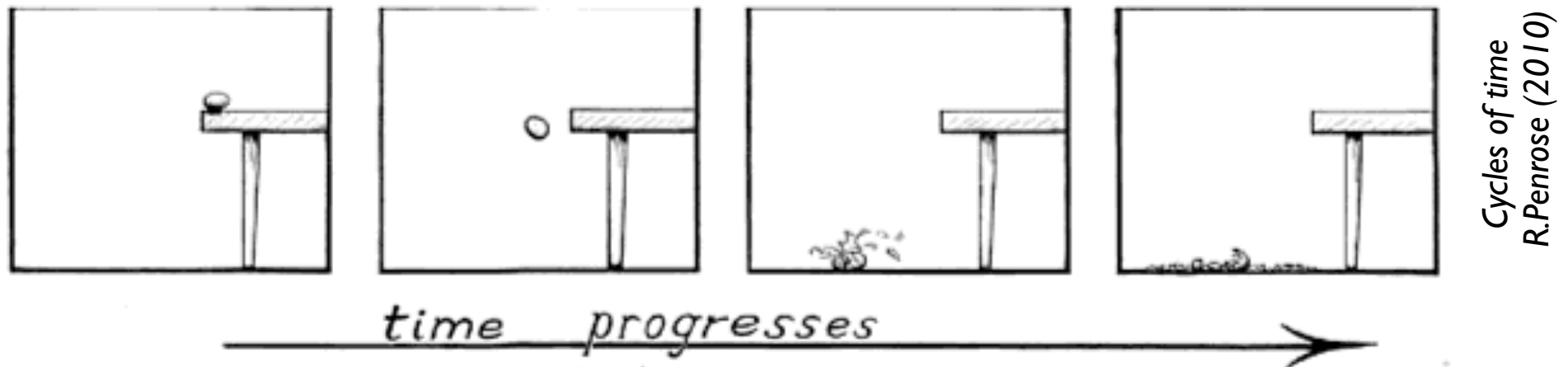
arXiv: 1510.06734
threeplusone.com

The 2nd Law of Thermodynamics

Clausius inequality
(1865)

Entropy
 $\Delta S_{\text{total}} \geq 0$

Entropy increases
as time progresses



Once or twice I have been provoked and asked the company how many of them could describe the Second Law of Thermodynamics. The response was cold. It was also negative. Yet I was asking something which is about the scientific equivalent of "Have you read a work of Shakespeare's?" – C. P. Snow

Entropy and Disorder

$$S = \log\{\text{Number of configurations}\}$$

1 natural unit of entropy
equivalent to
1 kT of thermal energy

T : Temperature (ambient 300 Kelvin)
k : Boltzmann's constant

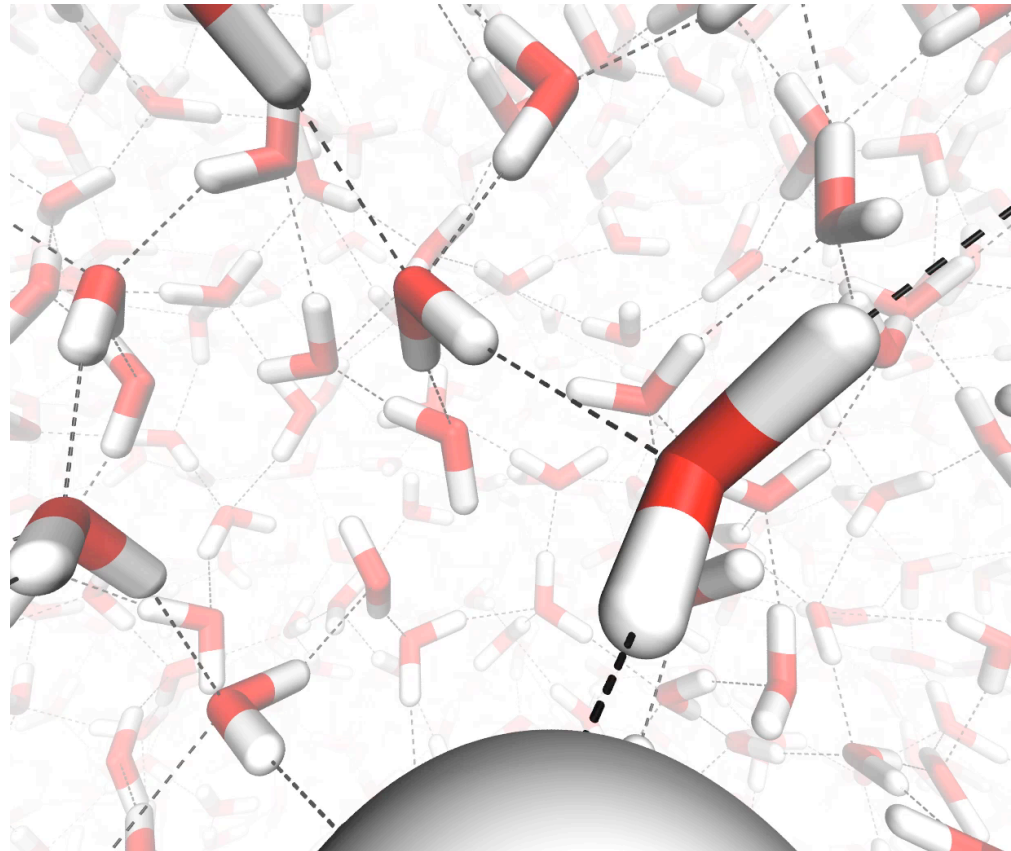
$$1 \text{ kT} = 25 \text{ meV} \\ = 2.5 \text{ kJ/mol}$$

$$\text{average kinetic energy} = 1.5 \text{ kT}$$



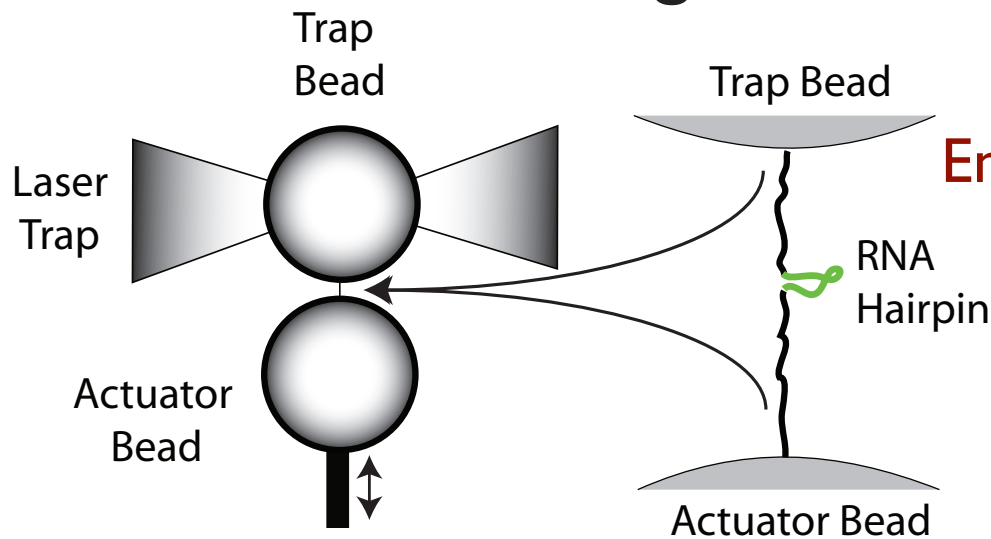
Thermodynamic Equilibrium

The future is the direction of time in which entropy increases

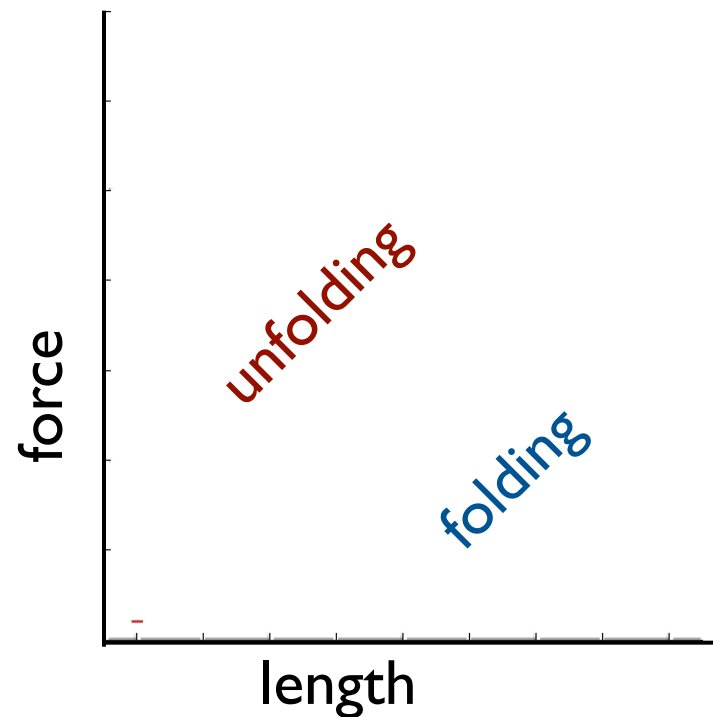
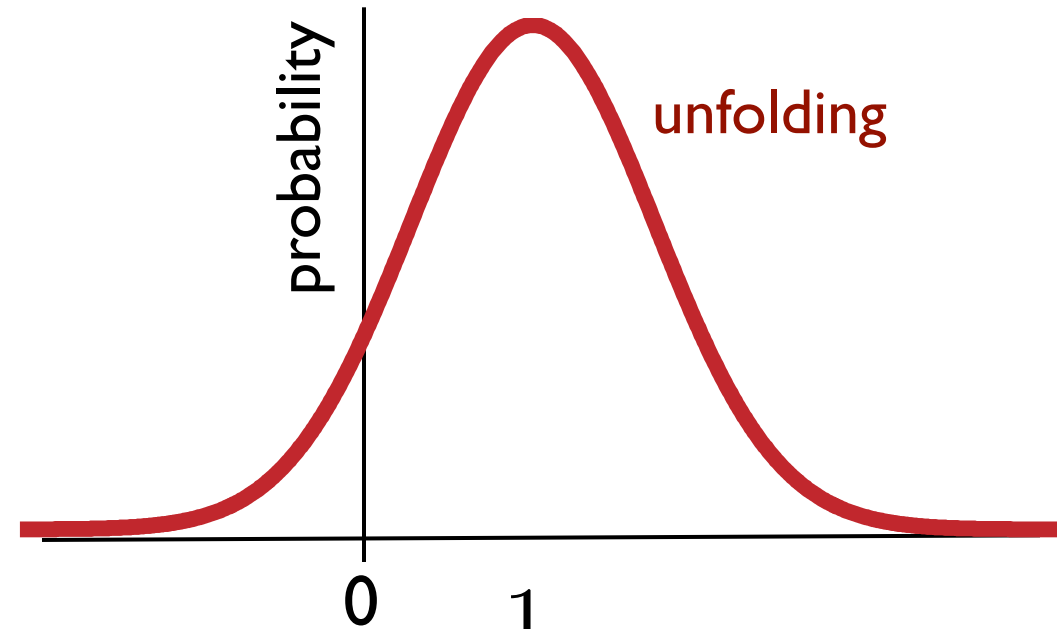


No change in Entropy. No Arrow of time.
Future, past and present are indistinguishable

Unfolding of RNA hairpins. (circa 2000)



Entropy sometimes goes down!



$$\Delta S_{\text{total}} = \frac{1}{T} (W - \Delta F)$$

total entropy change

temperature

work

free energy change

The (improved) 2nd Law of Thermodynamics

Clausius inequality
(1865)

$$\langle \Delta S_{\text{total}} \rangle \geq 0$$

equality only for
reversible process

Jarzynski identity
(1997)

$$\langle e^{-\Delta S_{\text{total}}} \rangle = 1$$

equality far-from-equilibrium

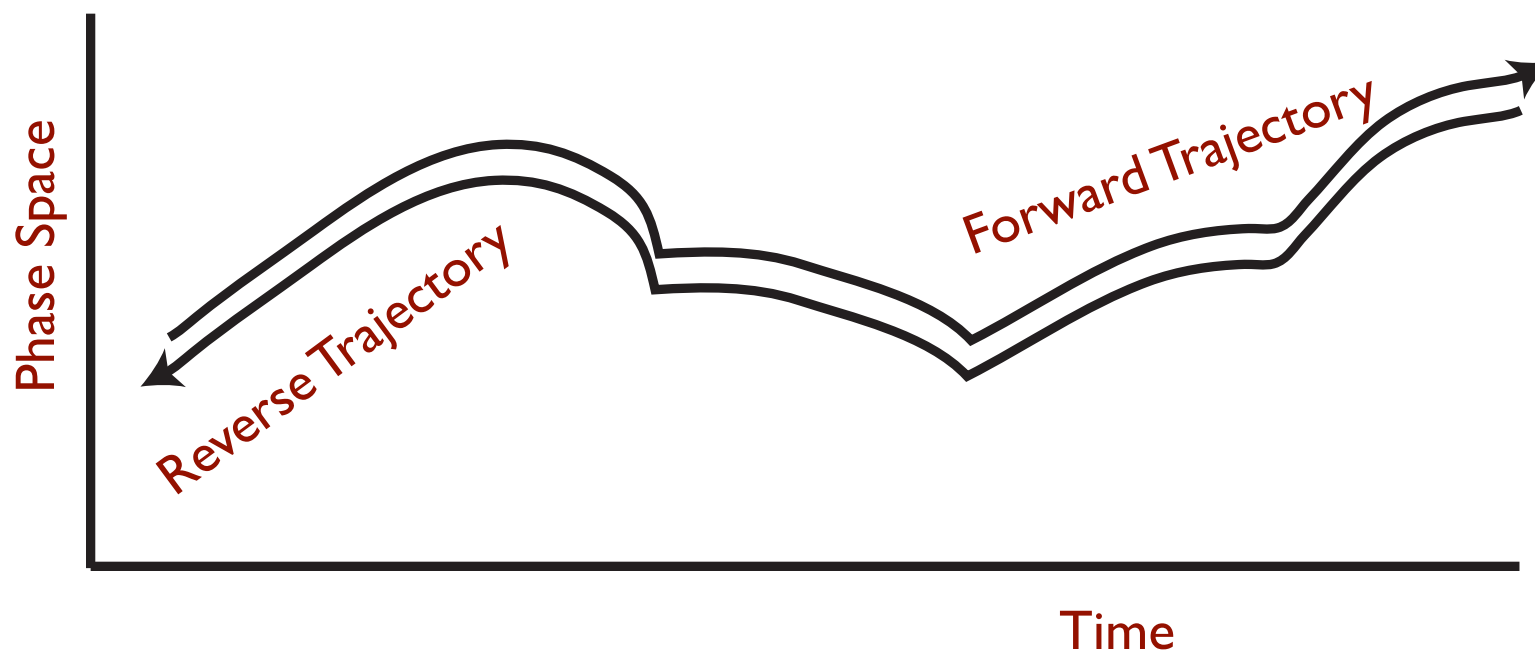
$$\Delta S_{\text{total}} = \frac{1}{T} (W - \Delta F)$$

Fluctuation Theorems:

Dissipation (entropy increase) breaks
time-reversal symmetry

$$\frac{P[\text{trajectory}]}{P[\text{time reversed trajectory}]} = e^{\text{dissipation}} = e^{\beta W - \beta \Delta F}$$

Inverse Temperature



What have we learned?

$$\langle e^{-\Delta S_{\text{total}}} \rangle = 1$$

- There are exact, general relations valid far-from-equilibrium
- *Trajectories* are the primary objects (rather than *states*)
- Fluctuations matter
- Entropy change breaks time *quantitatively* reversal symmetry
- Directly relevant at small dissipation (less than about 10 kT)
- Information flow is as important as work and heat flow.



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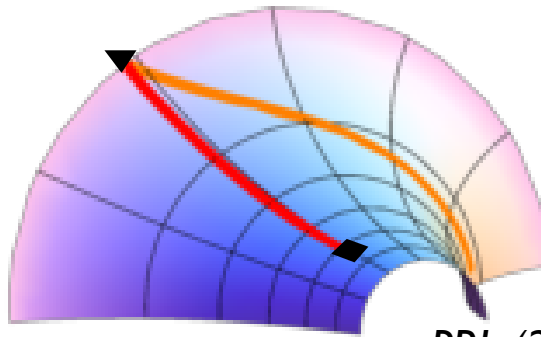
Recent Projects

Coupled Systems & the Thermodynamics of prediction



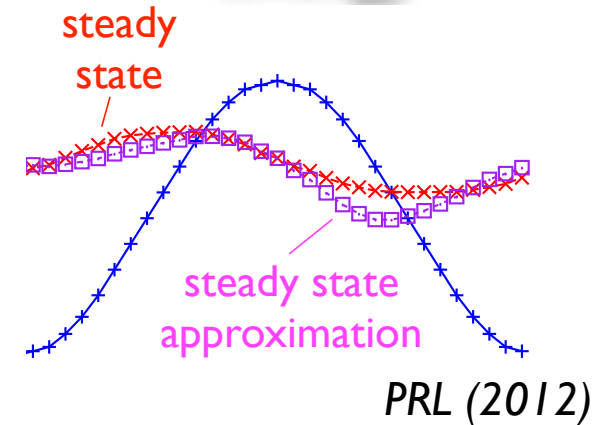
PRL (2012)

Geometry of thermodynamic control



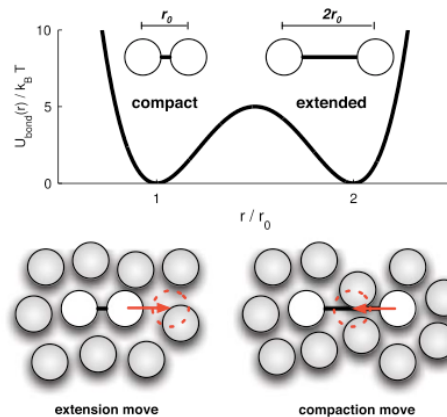
PRL (2012)
PRE (2012)

Measurement of nonequilibrium free energy



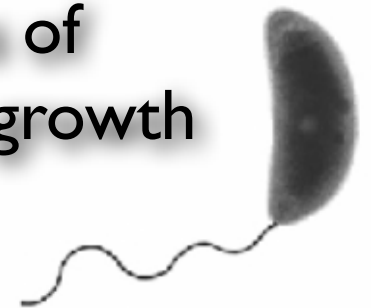
Nonequilibrium simulation

PNAS (2011) PRX (2013)
JPC (2014)

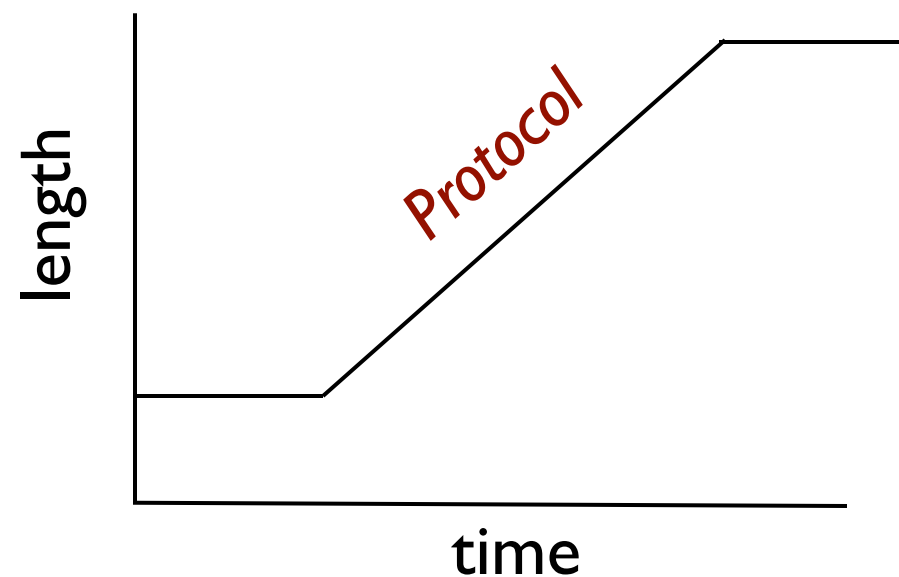
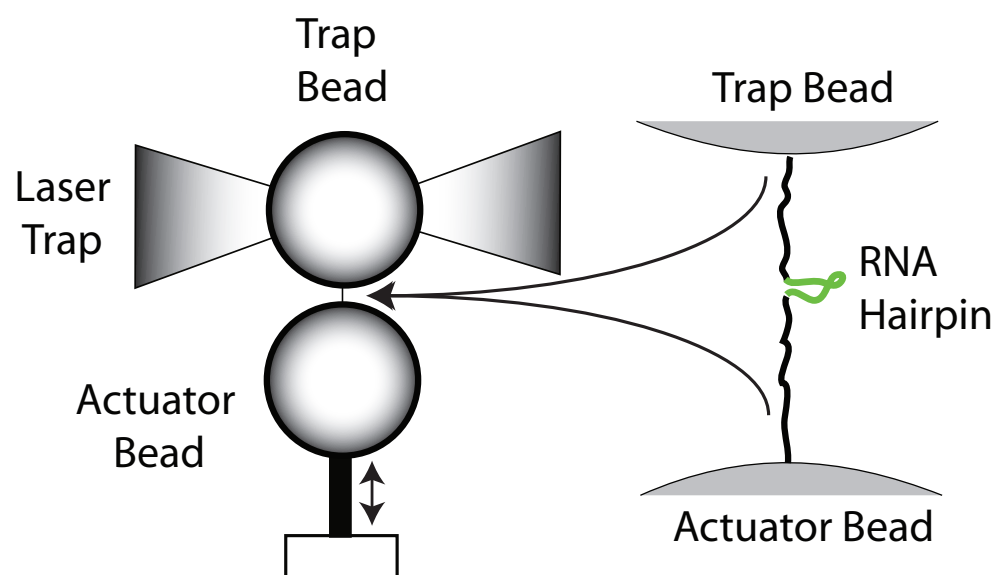


Dynamics of bacterial cell growth

PNAS (2014)
PRL (2014)

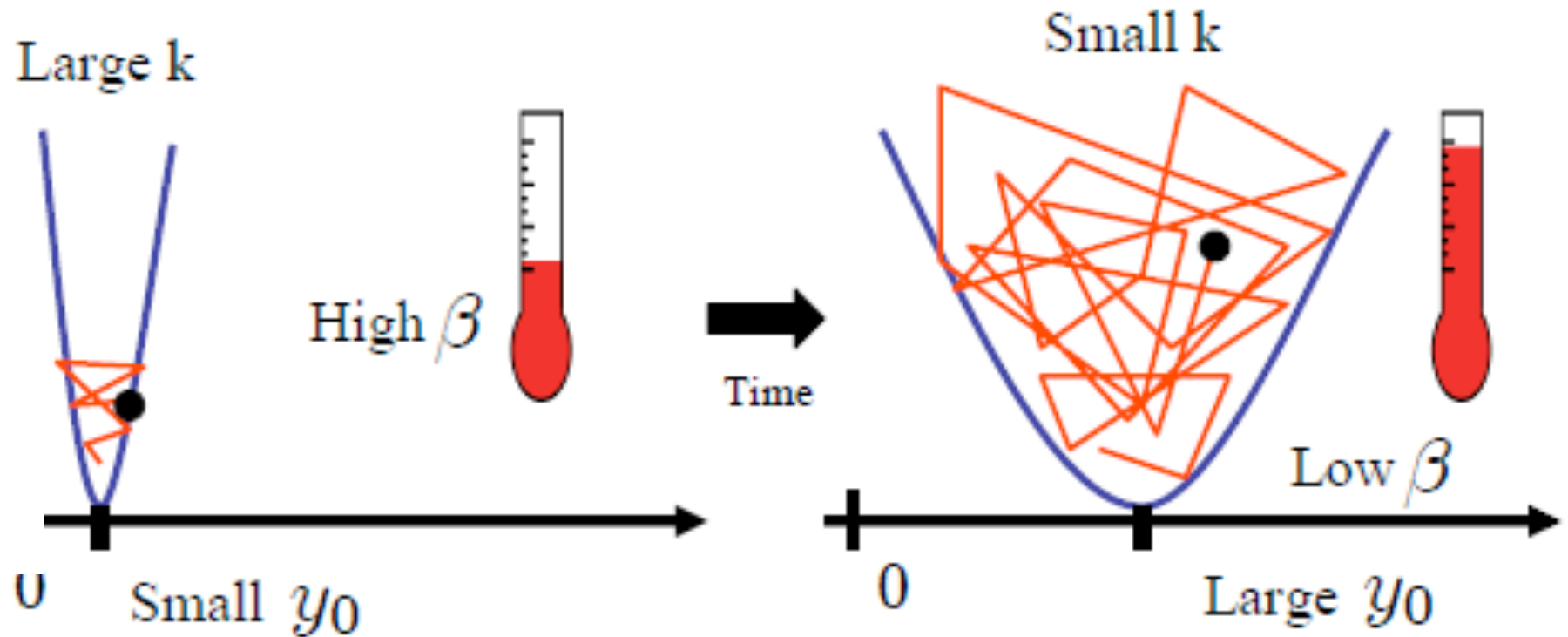


Optimal thermodynamic control of molecular scale systems



Which finite-time experimental protocols minimize dissipation?

Exact minimum dissipation protocols



Control trap position: Schmiedl & Seifert PRL (2007)

Geometry of thermodynamic control

- Finite time thermodynamics with linear response friction tensor
- Riemannian metric, minimum dissipation paths are *geodesics*

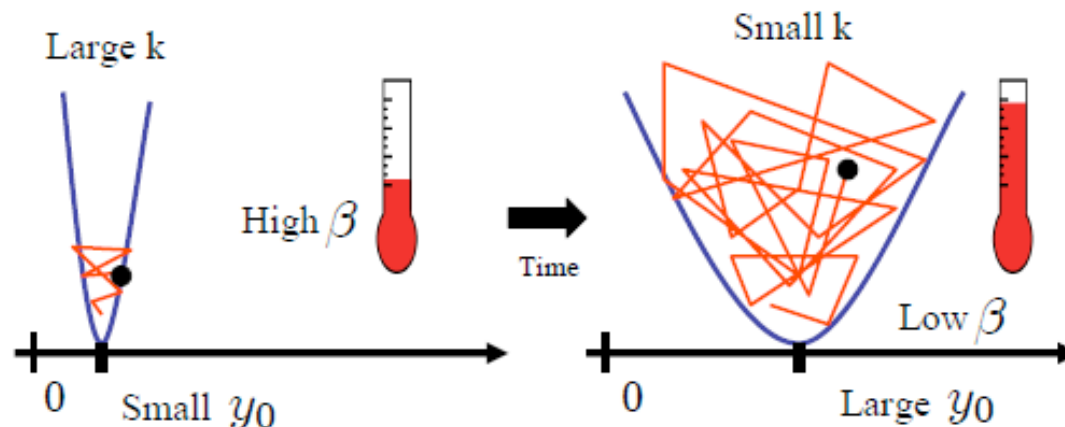


Prof. David Sivak
(Simon Fraser U.)

nonequilibrium
 excess power
 imposed by protocol Λ

$$\mathcal{P}_{\Lambda}^{\text{ex}}(t_0) = \left[\frac{d\lambda^T}{dt} \right]_{t_0} \cdot \zeta(\lambda(t_0)) \cdot \left[\frac{d\lambda}{dt} \right]_{t_0}$$

linear response
 friction tensor



F. Weinhold (1975), Peter Salamon and Steven Berry (1983), Sivak & Crooks PRL (2012)

Combine linear response and thermodynamic geometry

$$p(x|\lambda) = e^{\beta F(\lambda) - \beta E(x, \lambda)}$$

free energy points to $F(\lambda)$
inverse temperature points to β
controllable parameters points to λ

$$\zeta(\lambda)_{ij} = \beta \int_0^\infty dt \langle \delta X_j(0) \delta X_i(t) \rangle_\lambda$$

*positive semi-definite symmetric matrix
i.e. thermodynamic metric tensor*

correlations of conjugate variables

*nonequilibrium
excess power*

*linear response
friction tensor*

$$\mathcal{P}_\Lambda^{\text{ex}}(t_0) = \left[\frac{d\lambda^T}{dt} \right]_{t_0} \cdot \zeta(\lambda(t_0)) \cdot \left[\frac{d\lambda}{dt} \right]_{t_0}$$

imposed by protocol Λ

Sivak & Crooks PRL (2012)

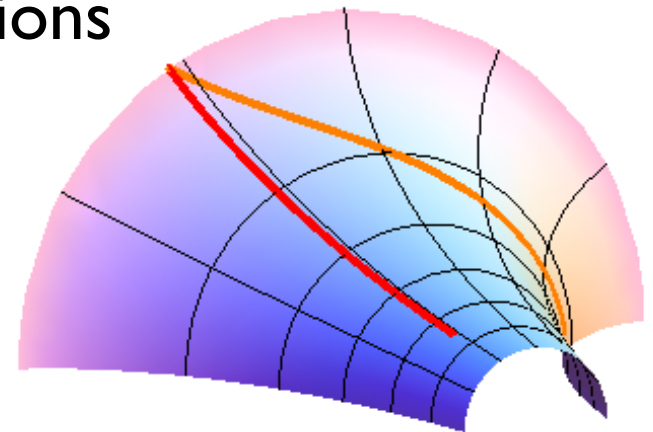
Geometry of thermodynamic control

- Linear response friction tensor yields a Riemannian metric
- Metric tensor measures friction in *control space*
- Optimal (minimum dissipation) protocols:
 - ▶ are geodesics in control space
 - ▶ independent of protocol duration
 - ▶ constant excess power
 - ▶ dissipation inversely proportional to protocol duration
 - ▶ minimize time for fixed dissipation
 - ▶ minimize error for free energy calculations

Rotskoff & Crooks (2015)

Sivak & Crooks (2012)

Peter Salamon and Steven Berry (1983)



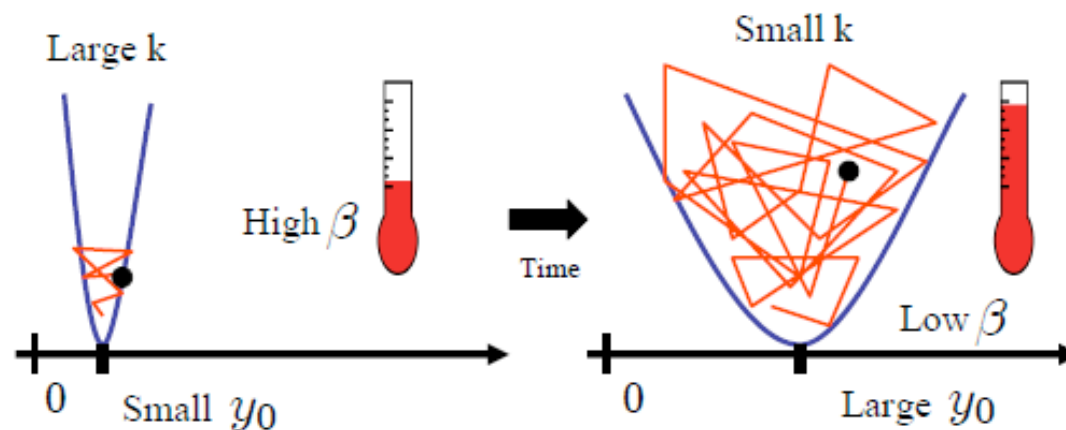
Thermodynamic Geometry of a Harmonic Trap

- Finite time thermodynamics with linear response friction tensor
- Riemannian metric, minimum dissipation paths are *geodesics*

nonequilibrium excess power imposed by protocol Λ

$$\mathcal{P}_{\Lambda}^{\text{ex}}(t_0) = \left[\frac{d\lambda^T}{dt} \right]_{t_0} \cdot \zeta(\lambda(t_0)) \cdot \left[\frac{d\lambda}{dt} \right]_{t_0}$$

linear response friction tensor



Sivak & Crooks, *Phys. Rev. Lett.*, 2012
 Zulkowski, Sivak, Crooks & DeWeese *Phys. Rev. E* 2012



David Sivak

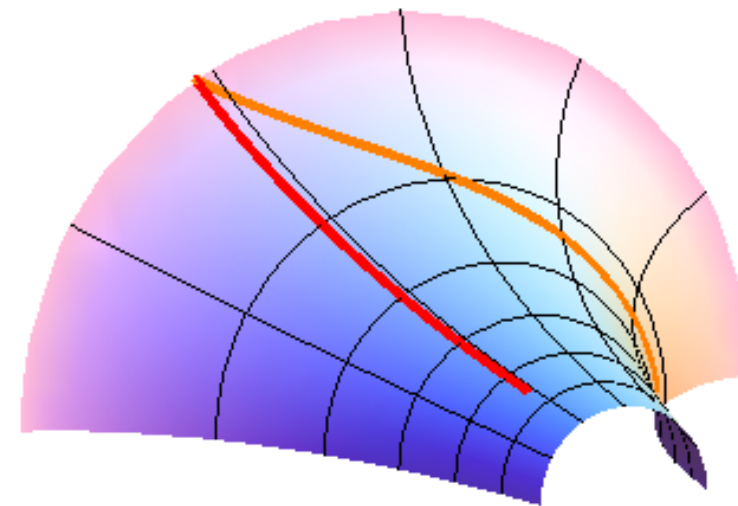
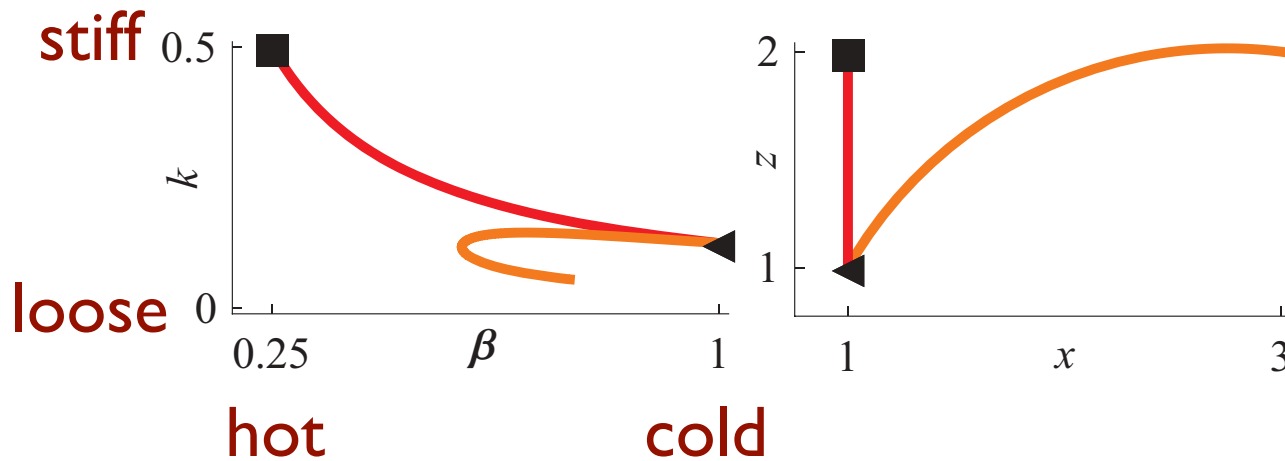
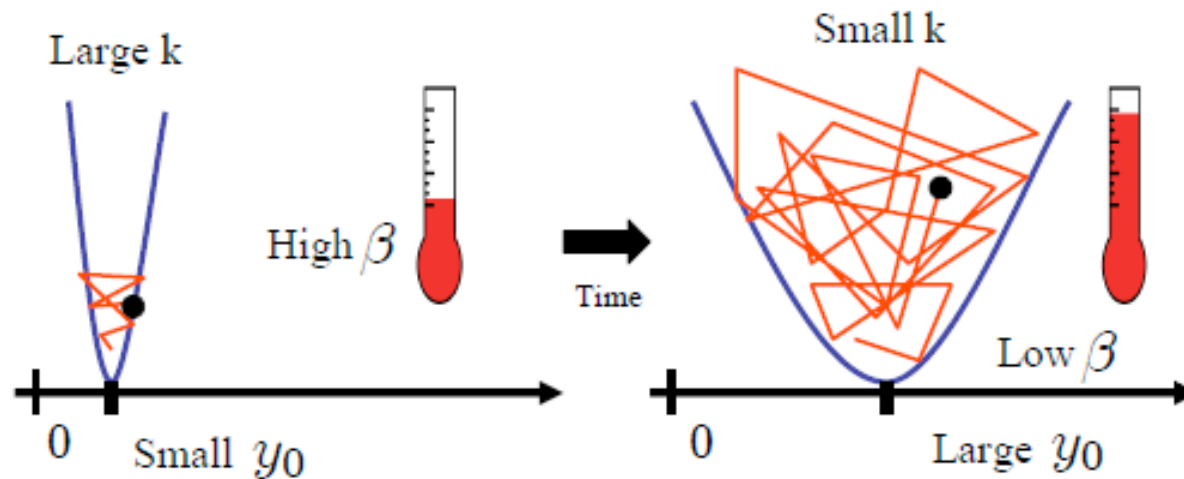


Michael DeWeese



Patrick Zulkowski

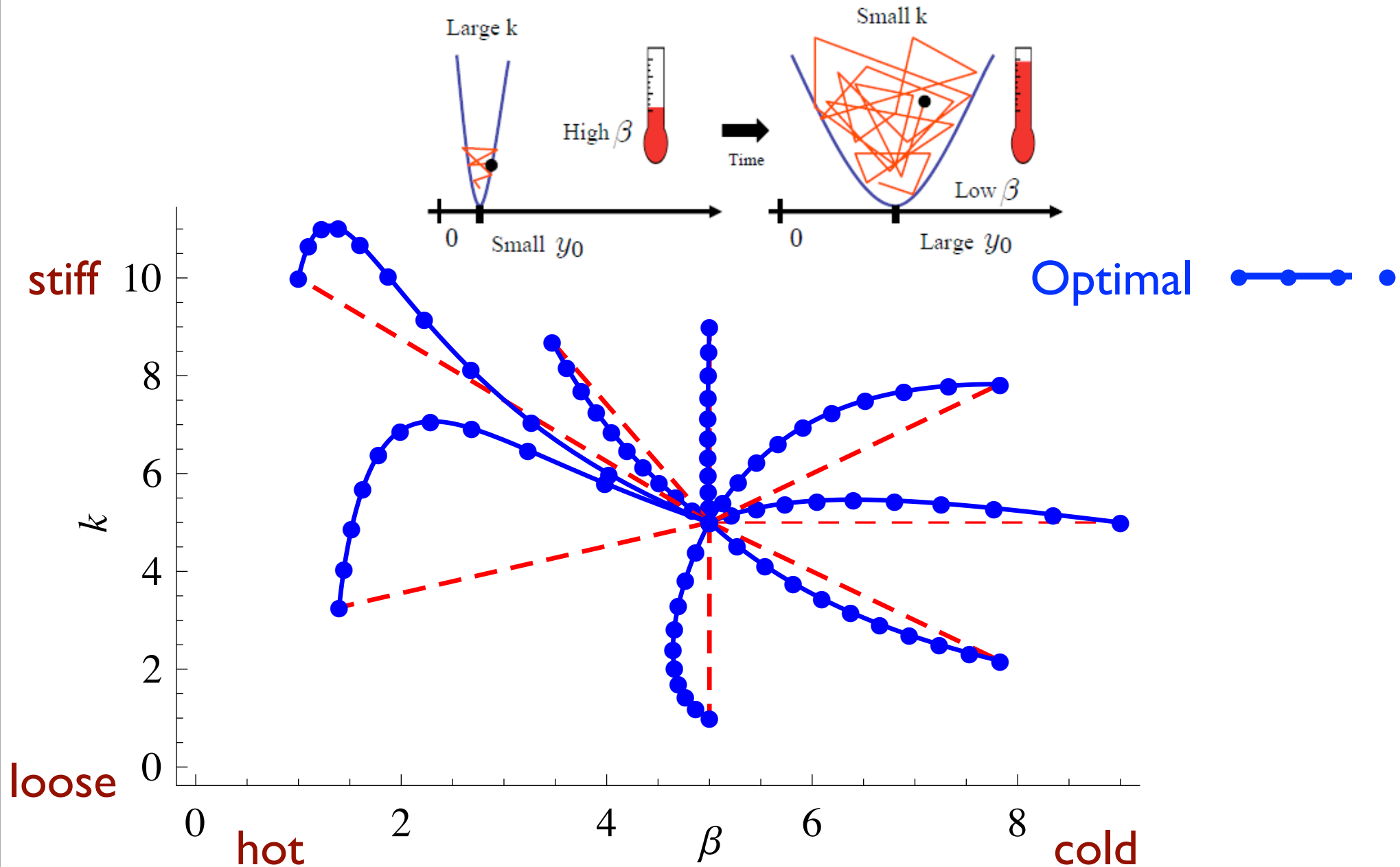
Thermodynamic Geometry of a Harmonic Trap



Hyperbolic geometry

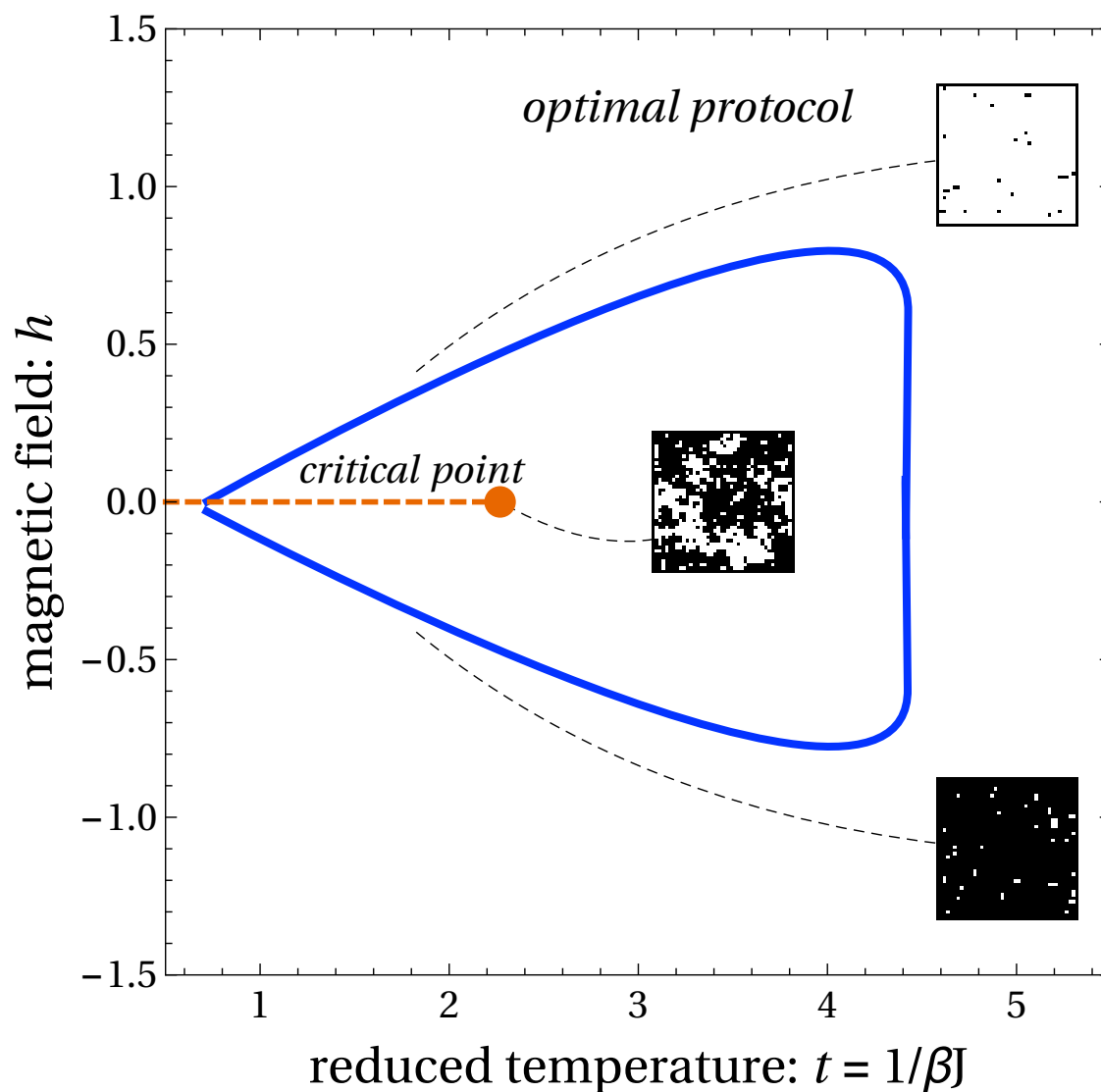
Zulkowski, Sivak, Crooks & DeWeese *Phys. Rev. E* 2012

Optimal Protocols

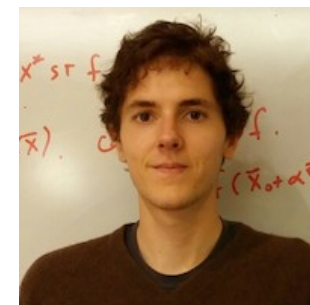


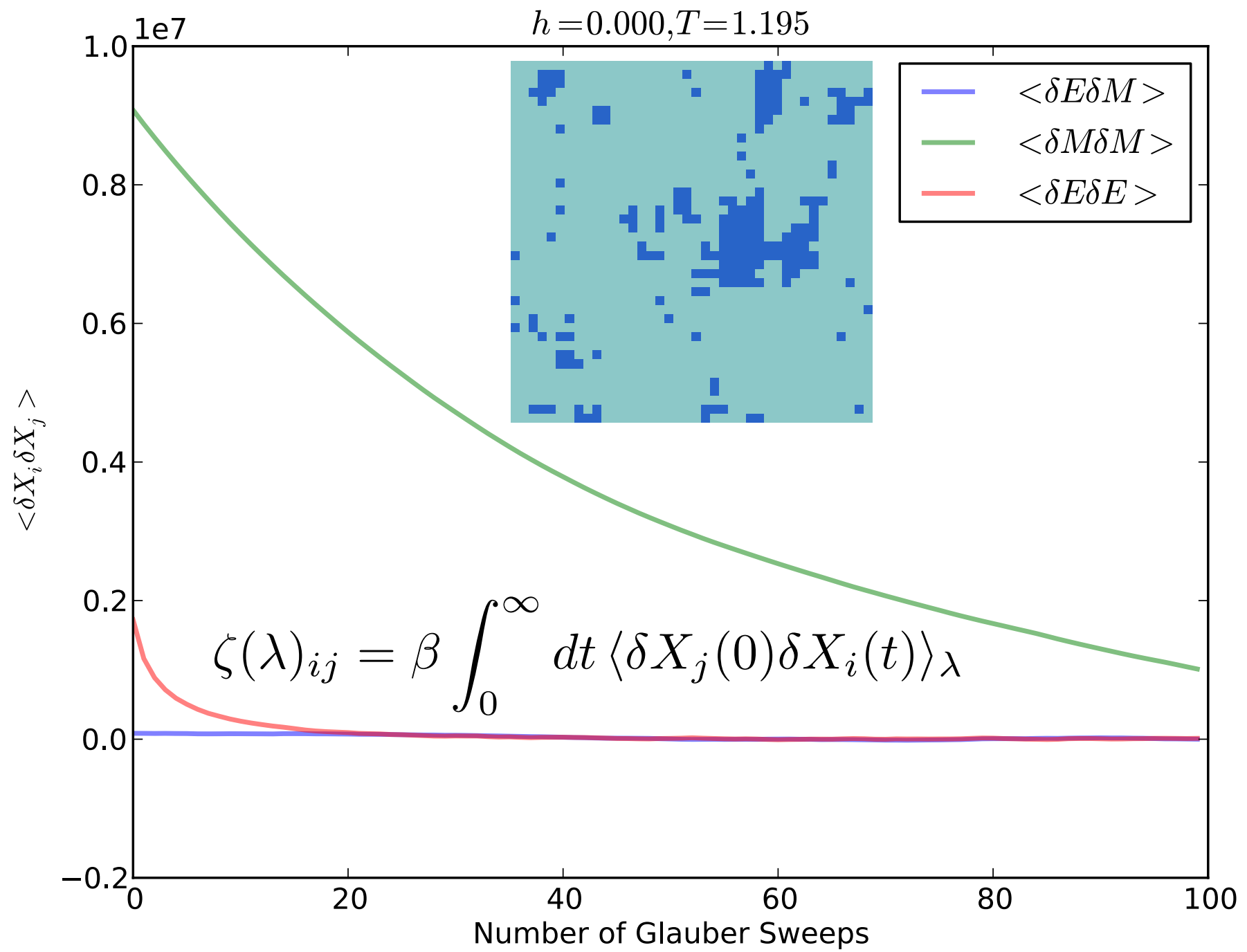
The Ising Model

$$H(\sigma) = -J \sum_{\langle ij \rangle} \sigma_i \sigma_j - h \sum_i \sigma_i$$



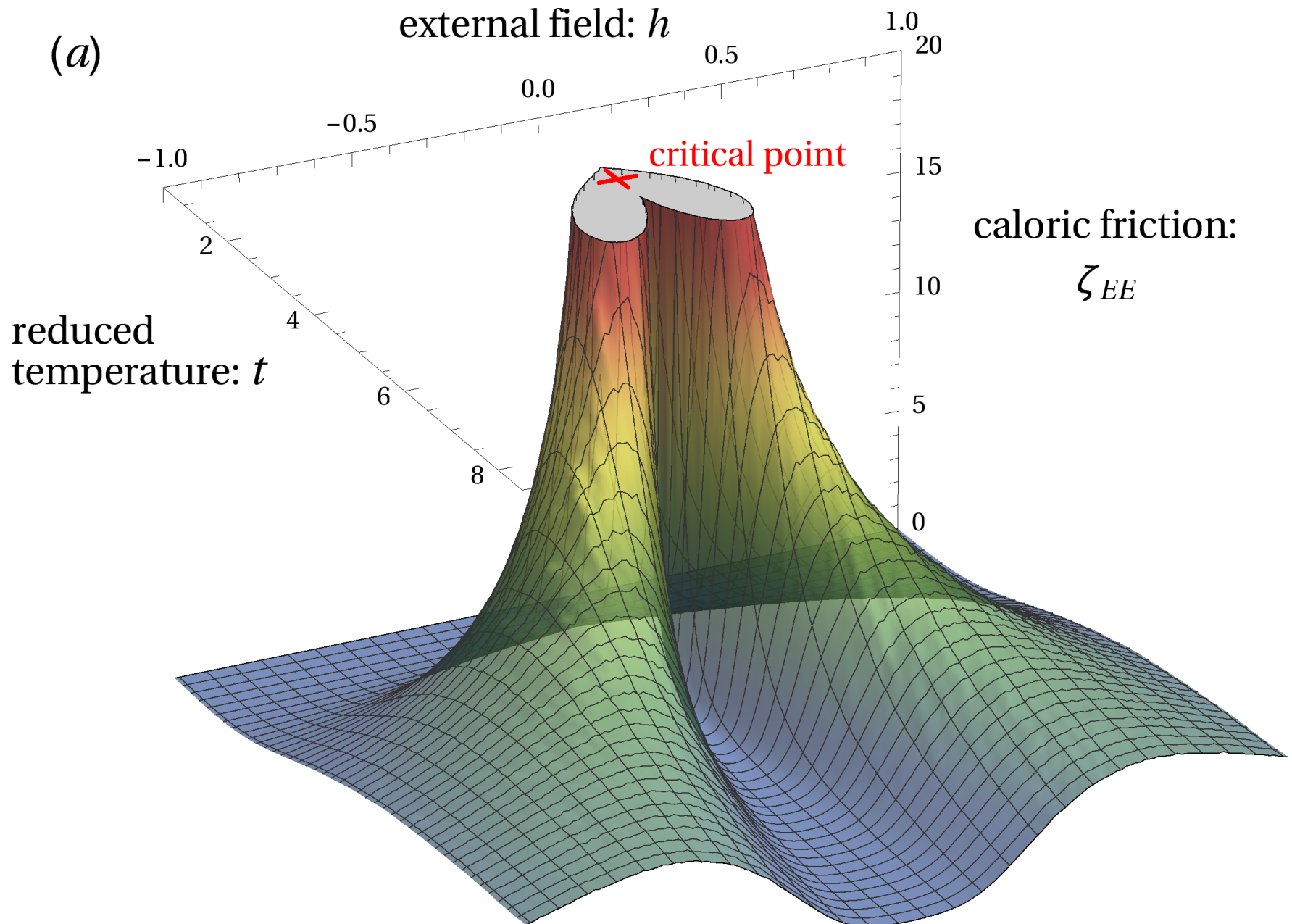
Grant
Rotskoff



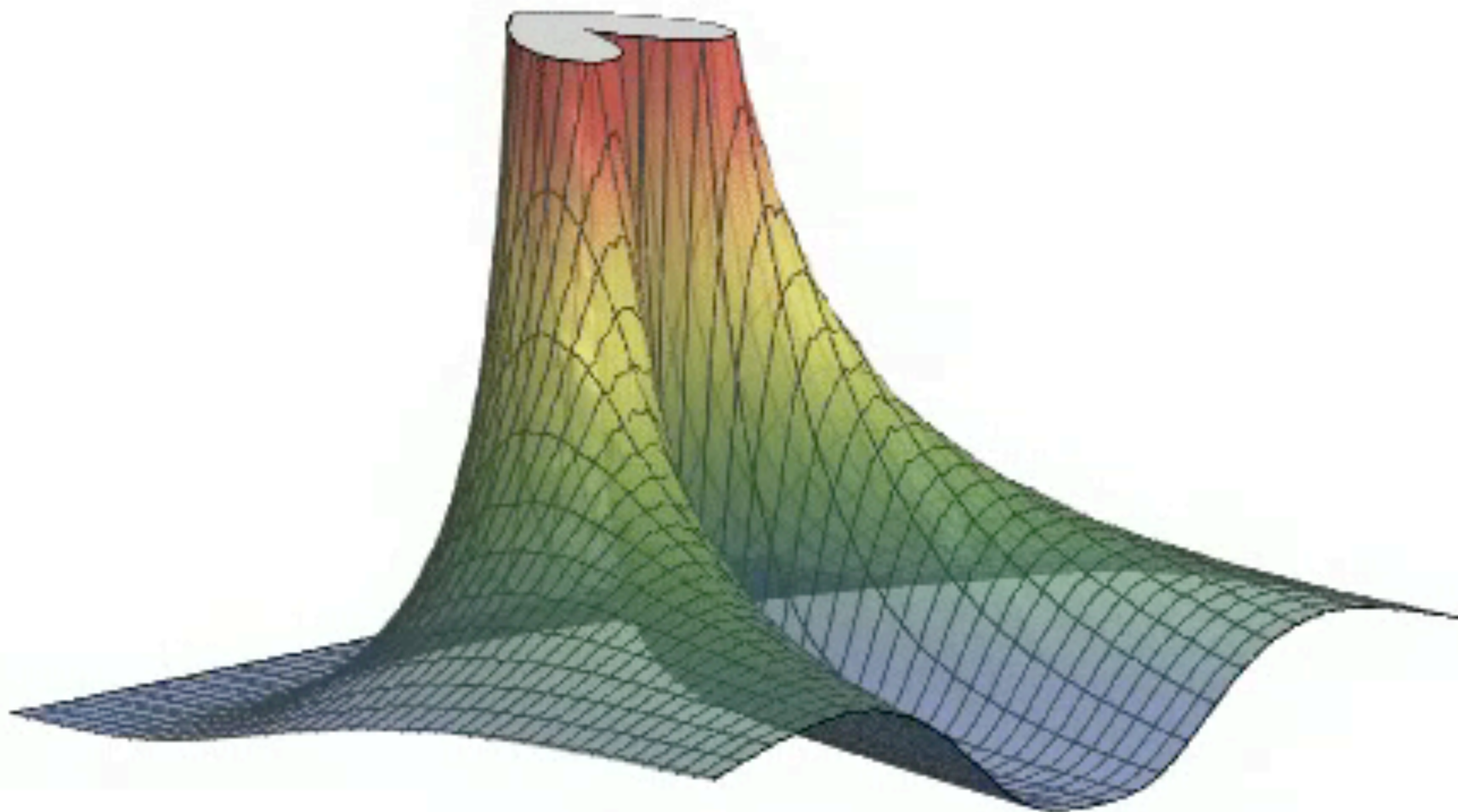


Energy-Energy

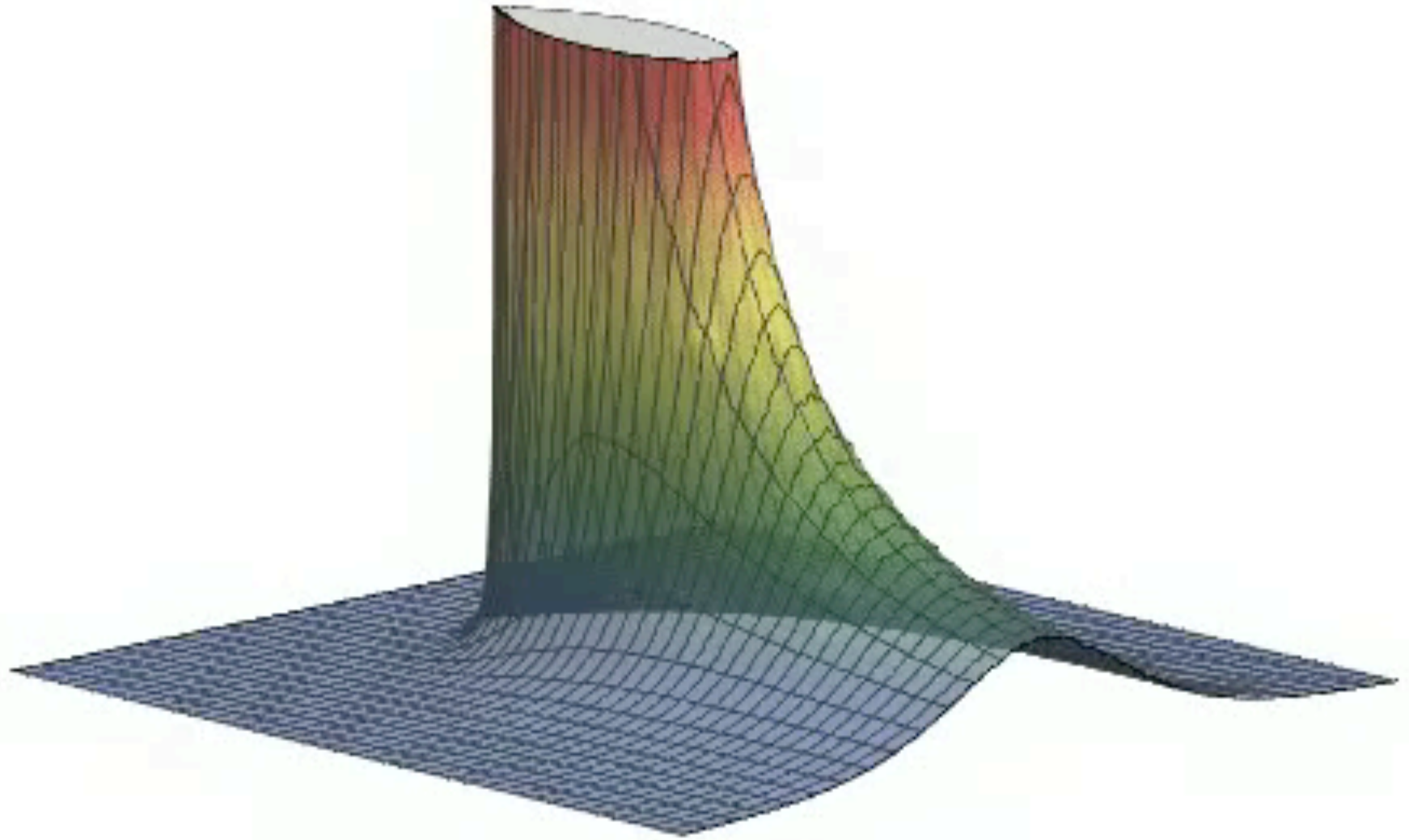
$$\zeta(\lambda)_{ij} = \beta \int_0^\infty dt \langle \delta X_j(0) \delta X_i(t) \rangle_\lambda$$



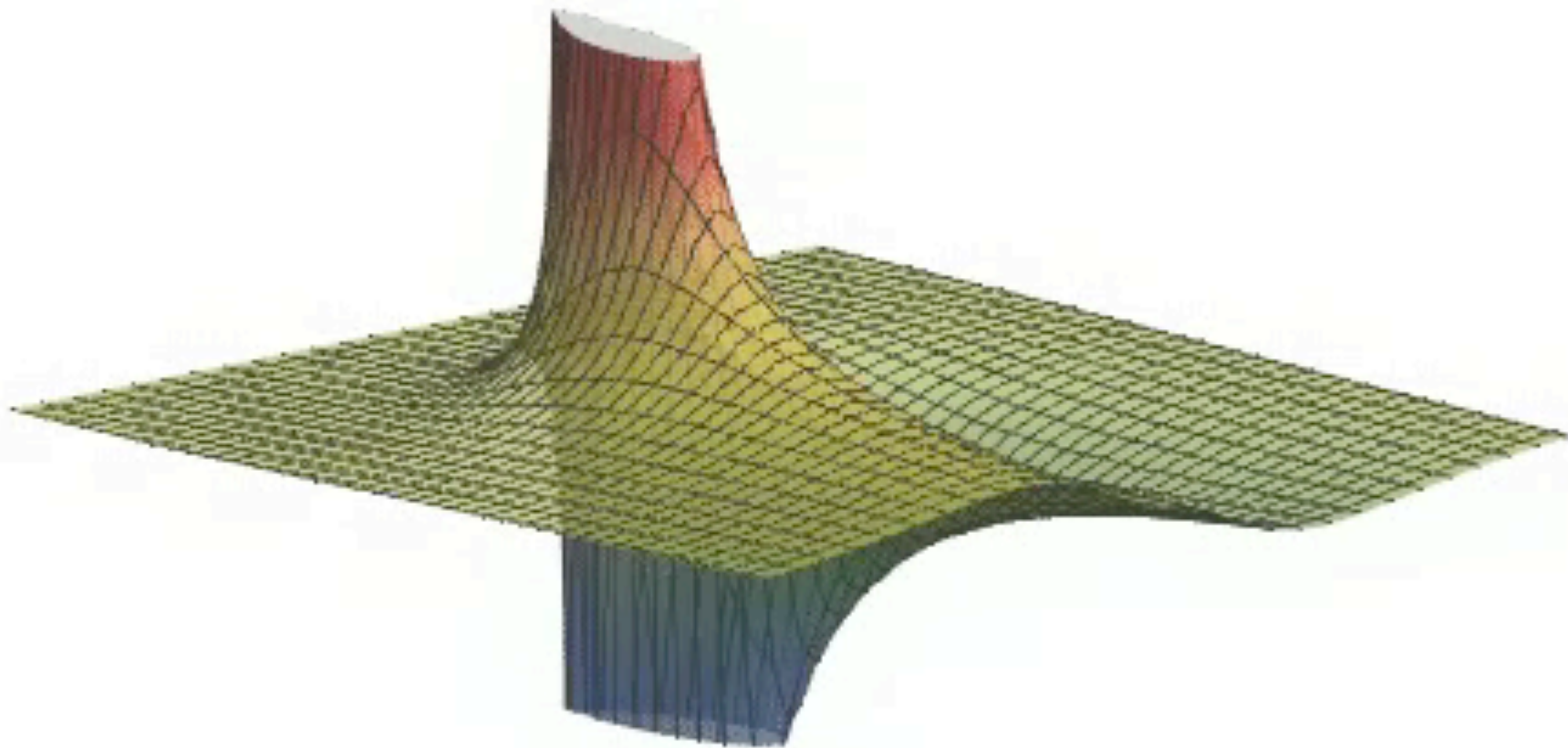
Energy-Energy



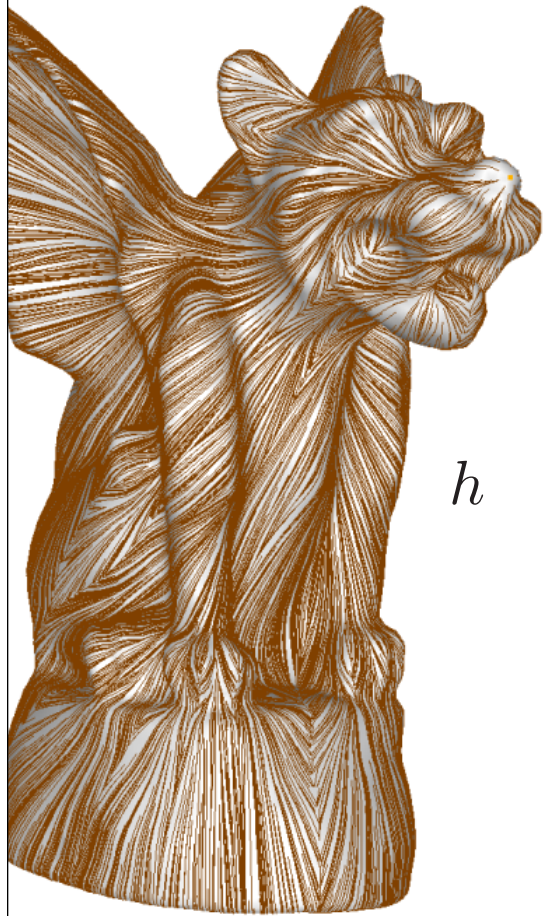
Magnetization-Magnetization



Energy - Magnetization

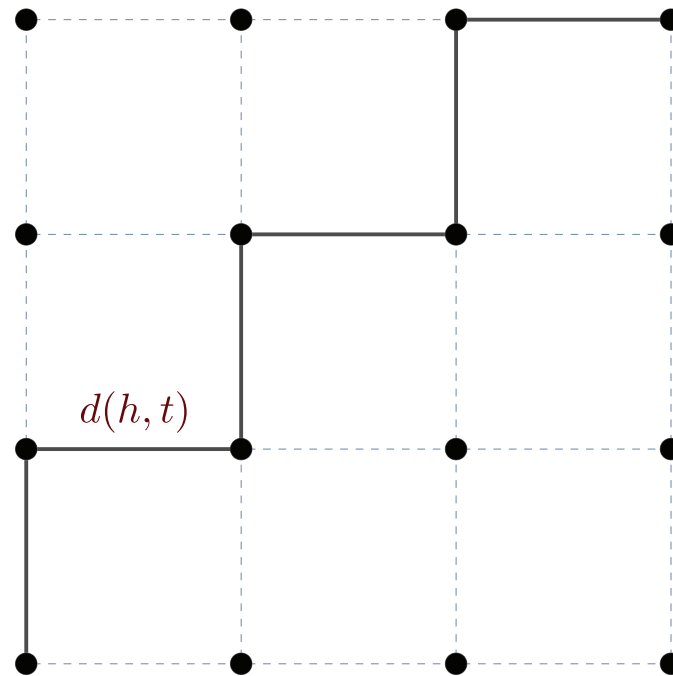


Fast Marching for Finding Geodesics on a Mesh.

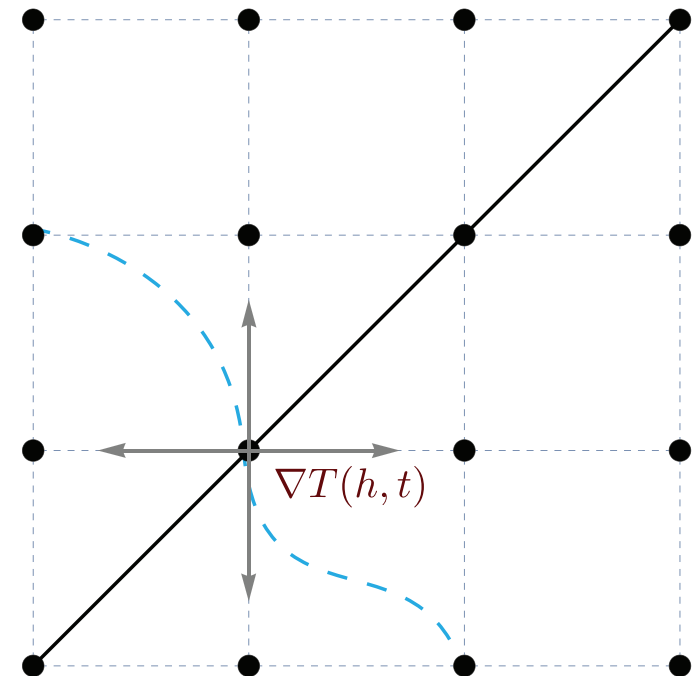


h

Dijkstra

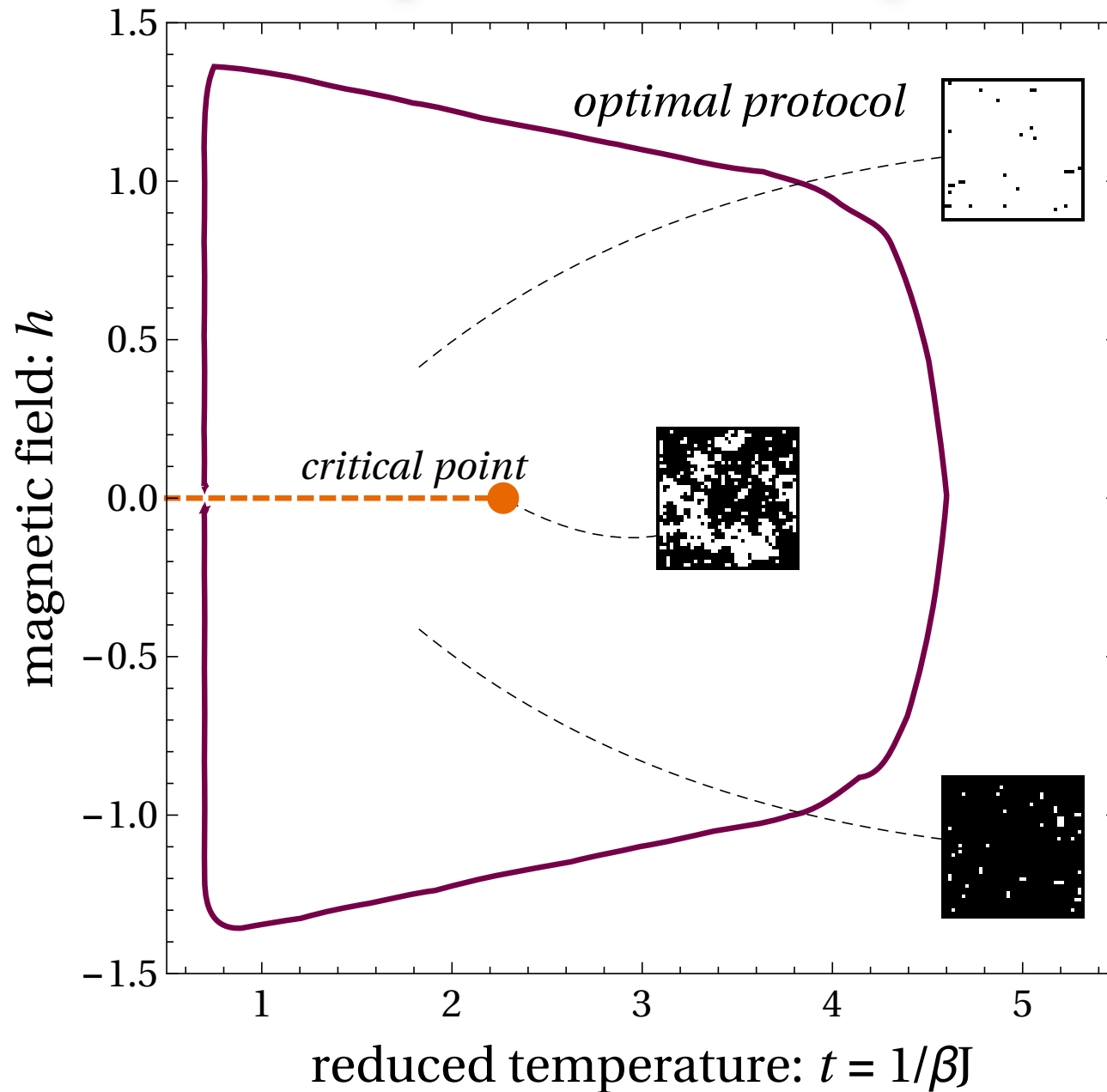


Fast Marching Method

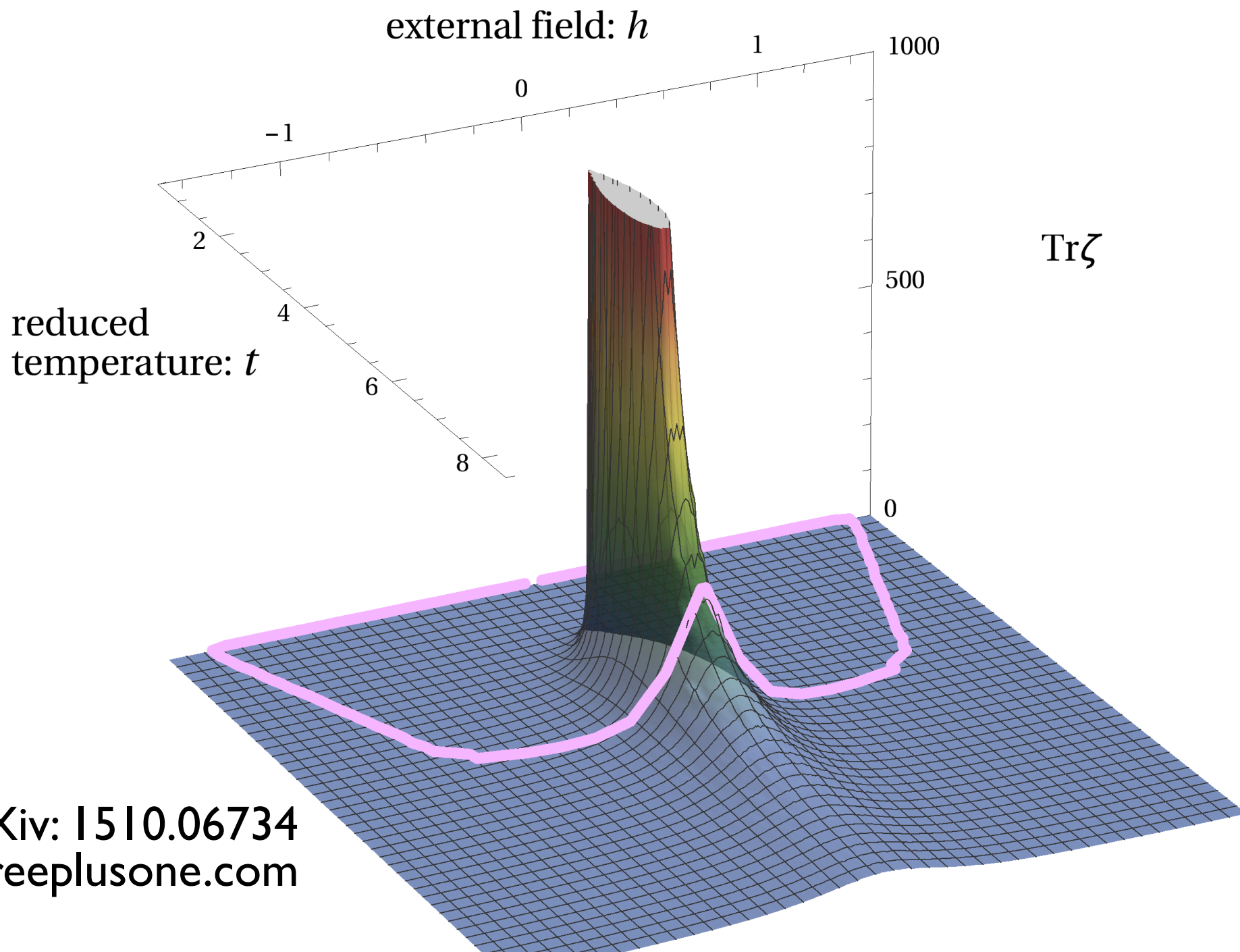


$$\frac{T - T_C}{T_C}$$

Minimum Dissipation Protocol (Geodesics)

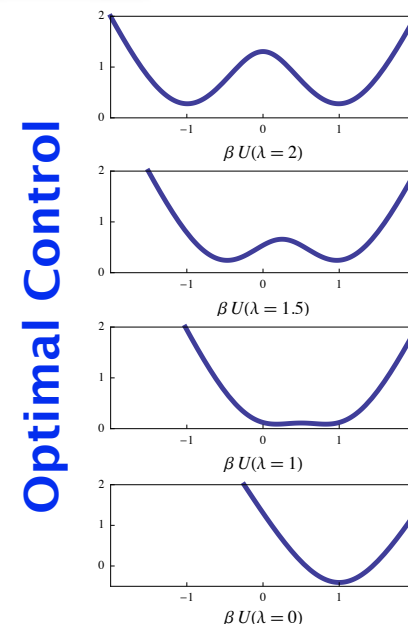
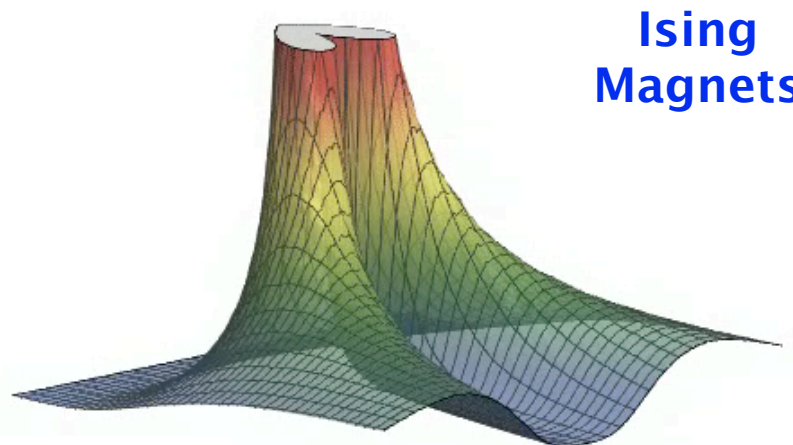
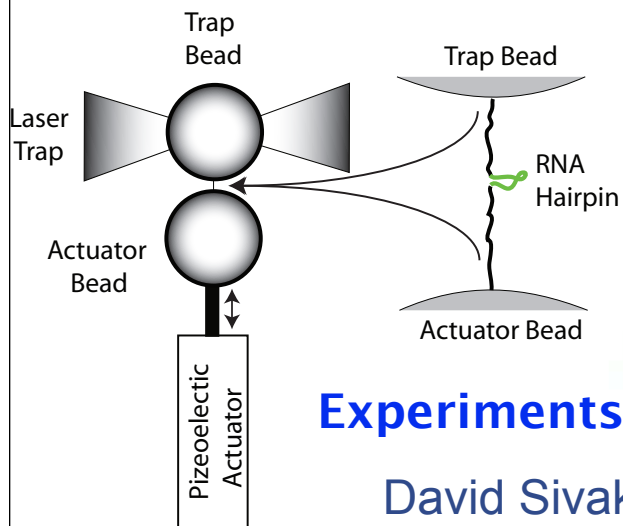


Minimum Dissipation Protocol (Geodesics)



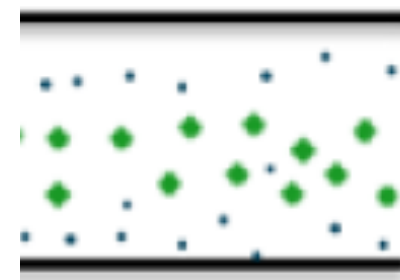
arXiv: 1510.06734
threeplusone.com

Frontiers of geometric thermodynamics



Patrick R. Zulkowski,
Michael R. DeWeese

Coordinate Dependent Diffusion

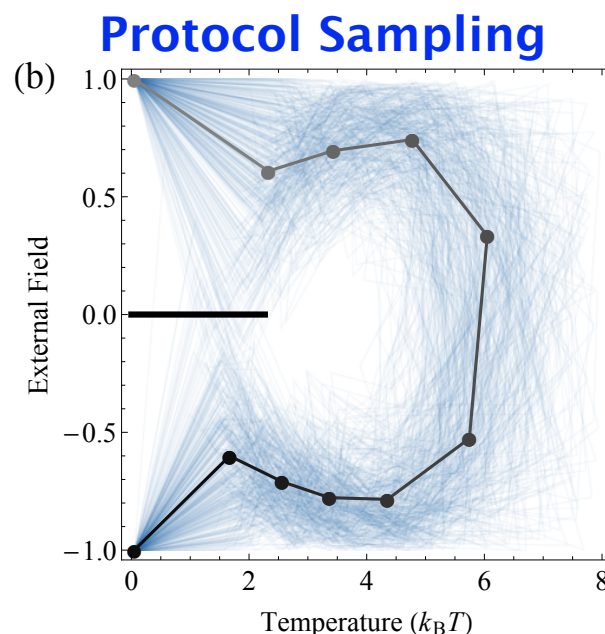


Alexander Berezhkovskii,
Attila Szabo

Steady states

$$\xi_{\mu\nu} = - \sum_{i,j} \pi_j \frac{\partial \ln \pi_i}{\partial \lambda_\nu} R_{ij}^+ \frac{\partial \ln \pi_j}{\partial \lambda_\mu}.$$

Dibyendu Mandal,
Chris Jarzynski



Todd Gingrich, Grant Rotskoff,
Phill Geissler

