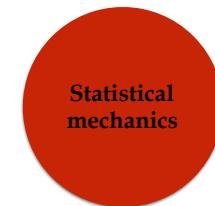


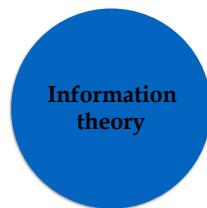
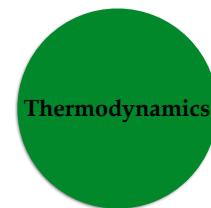
# Emerging Issues in Nonequilibrium Statistical Physics

Jae Dong Noh (University of Seoul)

Physics Colloquium at POSTECH (DEC 06, 2017)



ENTROPY



## Classical thermodynamics

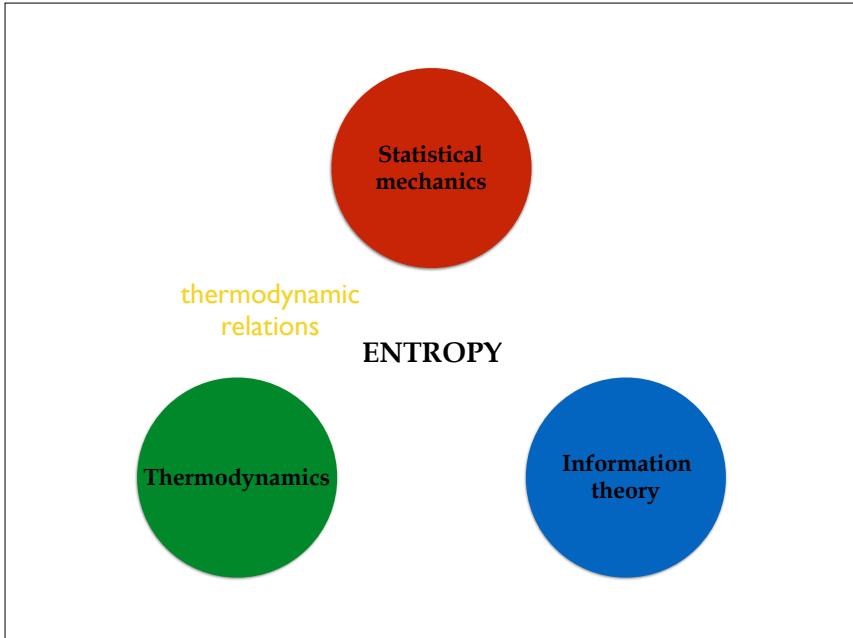
- Kelvin, Clausius, Carnot,...
- Entropy as a state function for thermal equilibrium systems

$$S(A) = \int_0^A \frac{dQ_{rev}}{T}$$

## Statistical mechanics

- Boltzmann, Maxwell, Gibbs, ...
- Entropy as a state function for thermal equilibrium systems

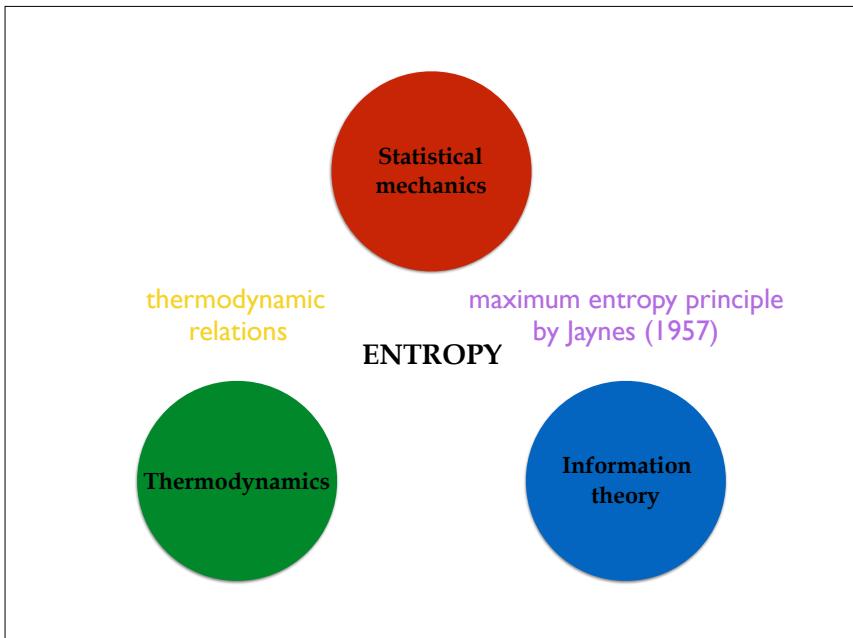
$$S(A) = k_B \ln \Omega(A)$$



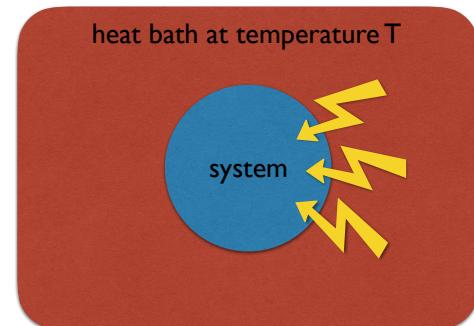
## Information theory

- C. E. Shannon, "A Mathematical Theory of Communication", *The Bell System Technical Journal* **27**, 379 (1948)
- Information as a measure of how much choice is involved in the selection of the event or of how uncertain we are of the outcome
- Set  $\{1,2,3,\dots,n\}$  with occurrence probabilities  $\{p_1,p_2,\dots,p_n\}$ .

$$H = \sum_{i=1}^n p_i \log_2 \frac{1}{p_i} = - \sum_i p_i \log_2 p_i \quad [\text{binary digit}]$$



## Thermodynamic systems out of equilibrium



relaxation  
 driving force  
 time-dependent process  
 feedback  
 multi heat baths  
 ...

## Nonequilibrium statistical mechanics

- Heat bath
  - ideal heat bath : thermal equilibrium always
  - its entropy is given by the Clausius relation
- Nonequilibrium physical system
  - ideal heat bath leads to stochastic dynamics
  - probability distribution  $P(q,t)$
  - Shannon entropy  $S[P] = -k_B \sum_q P(q,t) \ln P(q,t) = \langle -k_B \ln P(q,t) \rangle$

## Stochastic thermodynamics

- Stochastic equations of motion (Langevin eq)

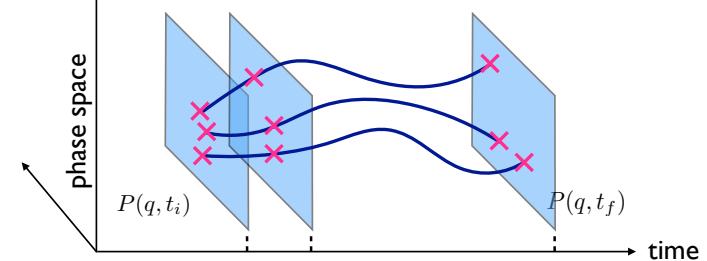
$$\frac{dx}{dt} = v$$

nonconservative driving force

$$m \frac{dv}{dt} = -\nabla U(x, \lambda(t)) + f_{nc}(x) - \gamma v + \sqrt{2\gamma T} \xi(t)$$

conservative force with t-dep. process      heat bath forces

- Statistical ensemble theory for the trajectory



## Stochastic thermodynamics

$$m \frac{dv}{dt} = -\nabla U(x, \lambda(t)) + f_{nc}(x) - \gamma v + \sqrt{2\gamma T} \xi(t)$$

- Trajectory dependent fluctuating thermodynamic quantities

$$\bullet \text{ work} \quad \Delta W = \int dt \left[ f_{nc}(x) \circ v + \frac{\partial U}{\partial \lambda} \frac{d\lambda}{dt} \right]$$

1st law of  
thermodynamics

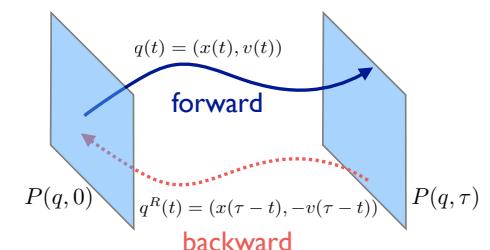
$$\bullet \text{ heat} \quad \Delta Q = \int dt \left[ (-\gamma v + \sqrt{2\gamma T} \xi(t)) \circ v \right]$$

2nd law of  
thermodynamics?

$$\bullet \text{ entropy} \quad \Delta S_{tot} = -\frac{\Delta Q}{T} + [-\ln P(q_f, t_f) + \ln P(q_i, t_i)]$$

## Stochastic thermodynamics

- Path probabilities



$$\text{Prob}^F[q(t)] = W[q(t)|q(0)]P(q(0), 0) \quad (\text{Forward})$$

$$\text{Prob}^R[q^R(t)] = W^R[q^R(t)|q^R(0)]P(q(\tau), \tau) \quad (\text{Backward})$$

# Stochastic thermodynamics

- Irreversibility

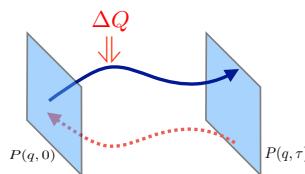
- log ratio of path probabilities

$$\ln \frac{\text{Prob}^F[q]}{\text{Prob}^R[q^R]} = \ln \frac{W[q(t)|q(0)]}{W^R[q^R(t)|q^R(0)]} + \ln \frac{P(q(0), 0)}{P(q(\tau), \tau)}$$

$$= -\frac{\Delta Q}{T} = \Delta S_{\text{bath}} \quad = \Delta S_{\text{sys}}$$

$$\Delta S_{\text{tot}}[q(t)] = \ln \frac{\text{Prob}^F[q(t)]}{\text{Prob}^R[q^R(t)]}$$

[Schnakenberg, RMP (1976)]  
[Lebowitz&Spohn, JSP (1999)]  
[Seifert, PRL (2005)]  
[Hinrichsen, Maes&Netocny, JSP (2003)]  
[Chun&Noh, (2017)]



# Fluctuation Theorem

- Integral FT for the total entropy production  $\langle e^{-\Delta S_{\text{tot}}} \rangle = 1$

- implication : **the second law of thermodynamics**  
(proof)  $\langle e^{-\Delta S_{\text{tot}}} \rangle = \int [Dq] \text{Prob}^F[q(t)] e^{-\Delta S_{\text{tot}}}$

$$1 = \langle e^{-\Delta S_{\text{tot}}} \rangle \geq \langle 1 - \Delta S_{\text{tot}} \rangle = \int [Dq] \text{Prob}^F[q(t)] \frac{\langle \Delta S_{\text{tot}} \rangle^R[q^R(t)]}{\text{Prob}^F[q(t)]} = 1$$

- Detailed FT

- probability distribution  $P(S) = \langle \delta(\Delta S_{\text{tot}} - S) \rangle$

- in the steady state



# Fluctuation theorems

- Work

- Jarzynski equality or IFT  $\langle e^{-\beta W} \rangle = e^{-\beta \Delta F} \implies W \geq \Delta F$   
[Jarzynski, PRL (1997)]

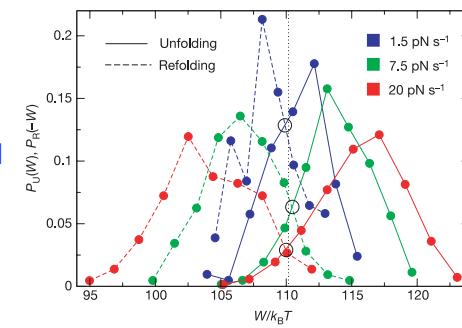
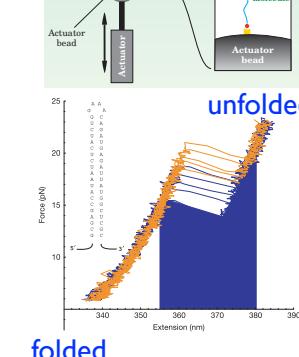
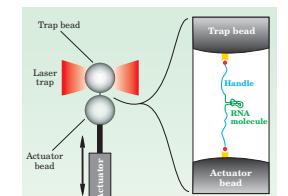
- Crooks relation or DFT  $\frac{P_F(W)}{P_R(-W)} = e^{\beta(W - \Delta F)}$   
[Crooks, PRE (1999)]

- Heat

- modified DFT  $\frac{P_F(Q)}{P_R(-Q)} = e^{\beta(-Q - \Delta F)} / \Psi(Q)$  [Noh and Park, PRL (2012)]

- And many others...

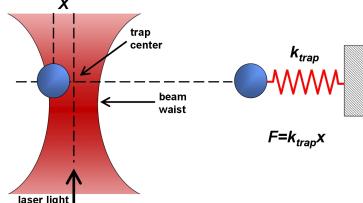
# Experiments



[Collin et al, Nature 437, 231 (2005)]

# Experiments

Colloidal particle trapped by the optical trap ( $\approx$ harmonic potential)



moving trap

$$-\gamma \dot{x} = -k(x - vt) + \sqrt{2\gamma T} \xi(t)$$

[Wang et al, PRL (2002)]  
[vanZon&Cohen, PRL (2003)]

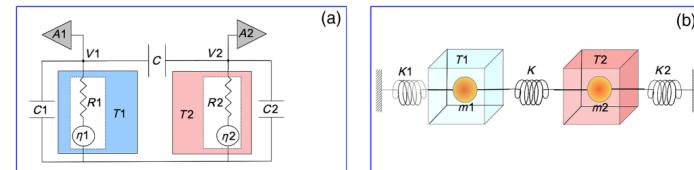
breathing trap

$$-\gamma \dot{x} = -k(t)x + \sqrt{2\gamma T} \xi(t)$$

[Lee&Kwon&Pak, PRL (2015)]

# Experiments

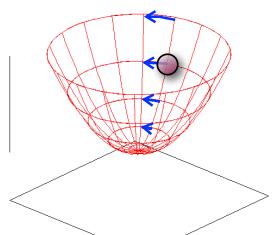
RC circuits



[Ciliberto et al, PRL (2013)]

# Analytic works

Linear system

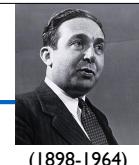


$P(W)$  or  $P(Q)$  directly  
to test the various FTs

[Kwon&Noh&Park, PRE (2011)]  
[Noh&Park, PRL (2012)]  
[Noh&Kwon&Park, PRL (2013)]  
[Kwon&Noh&Park, PRE (2013)]

particle trapped in a harmonic potential and  
driven by a nonconservative rotation force

# Szilard Engine



Single gas particle in a single heat bath of temperature  $T$

$$W = Q = T \ln 2$$

extracting work  
from a single bath

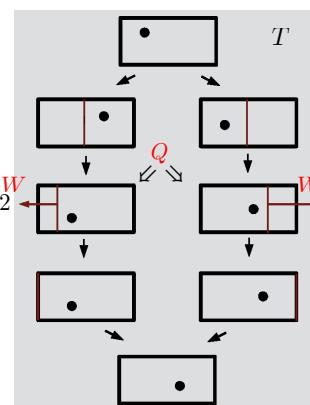
$$\Delta S_{gas} = 0$$

$$\Delta S_{bath} = -\frac{Q}{T} = -\ln 2$$

$$\Delta S_{bath} + \Delta S_{gas} < 0$$

second law?

Brillouin (1951)  
Landauer (1961)  
...



measurement and  
feedback control by  
isothermal expansion

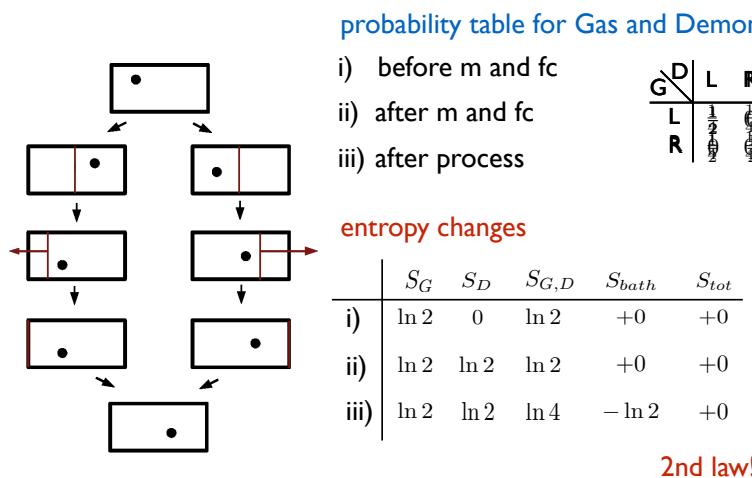
Brillouin (1951)  
Landauer (1961)  
...

= cousin of  
Maxwell's demon

Brillouin (1951)  
Landauer (1961)  
...

= cousin of  
Maxwell's demon

# Szilard Engine



# Information thermodynamics

[Sagawa&Ueda, PRL (2008, 2010, 2012)]

- In the presence of Maxwell's demon

$$\begin{aligned} S_{tot} &= S_{sys,demon} + S_{bath} \\ &= S_{sys} + S_{demon} - I(sys; demon) + S_{bath} \end{aligned}$$

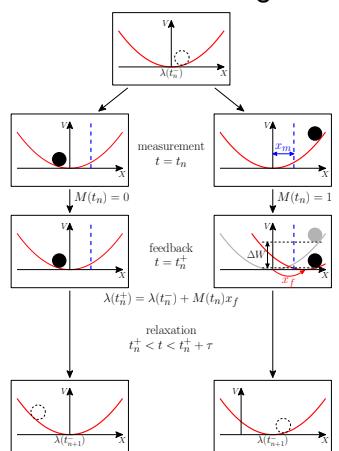
mutual information

- Extended second law

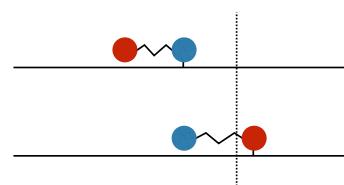
$$\Delta(S_{sys} + S_{demon} + S_{bath}) \geq \Delta I(sys; demon)$$

# Information device

information heat engine



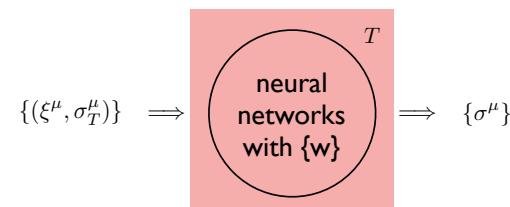
information motor



[Park&Lee&Noh, PRE (2016)]

# Thermodynamic bounds

- Stochastic learning in neural networks without feedback

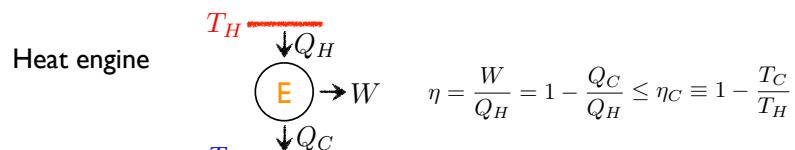


- Learning efficiency is bounded by the thermodynamic cost

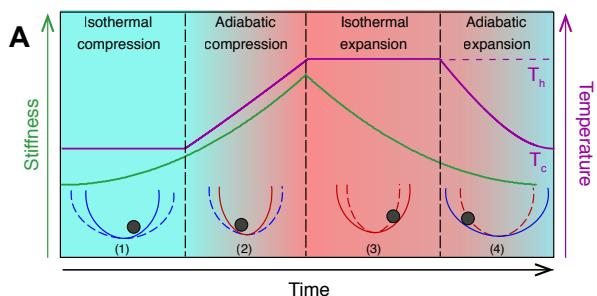
$$I(\sigma_T; \sigma) \leq \Delta S(w) + \Delta Q/T \quad [\text{Goldt}&\text{Seifert, PRL (2017)}]$$

- Efficiency bound for a machine learning with feedback

# Microscopic heat engines

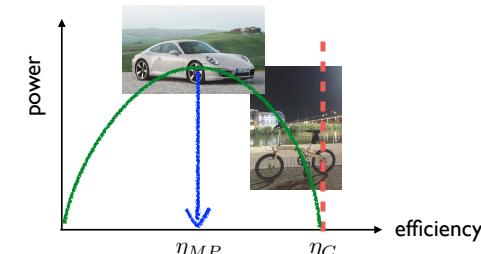


Brownian heat engine [Martinez et al, NatPhys (2016)]



# Microscopic heat engines

- Efficiency vs Power



- Efficiency at maximum power

- Trade-Off relation between power and efficiency

$$\frac{W}{\tau} \leq \bar{\Theta} \beta_L \eta (\eta_C - \eta) \quad [\text{Shiraishi\&Saito\&Tasaki, PRL (2016)}]$$

# Thermodynamic uncertainty relation

- Nonequilibrium system driven by external field,

fluctuating time-integrated current  $X = J t$   
heat dissipation with rate  $q$

- Thermodynamic uncertainty relation

$$\mathcal{Q} \equiv \frac{\langle X^2 \rangle - \langle X \rangle^2}{\langle X \rangle^2} \times \frac{qt}{T} = \frac{(\delta J)^2}{J^2} \times q \geq 2 \quad [\text{Barato\&Seifert, PRL (2015)}]$$

uncertainty  $\epsilon = \delta J/J$  requires at least a cost of  $2/\epsilon^2$

# Velocity-dependent forces

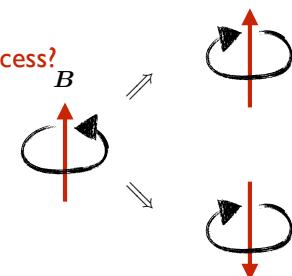
- Charged particles with  $B$  field, active particles, ...

- Entropy as Irreversibility  $\Delta S_{tot}[q(t)] = \ln \frac{\text{Prob}^F[q(t)]}{\text{Prob}^R[q^R(t)]}$

- Reverse process to a given forward process?

- Fluctuation-dissipation relations,...

[Chun\&Noh, arXiv (2017)]  
[Lee\&Lahiri\&Park, PRE (2017)]  
[Yeo\&Kwon\&Lee\&Park, JSTAT (2016)]  
[Lee\&Kwon\&Park, PRL (2013)]



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