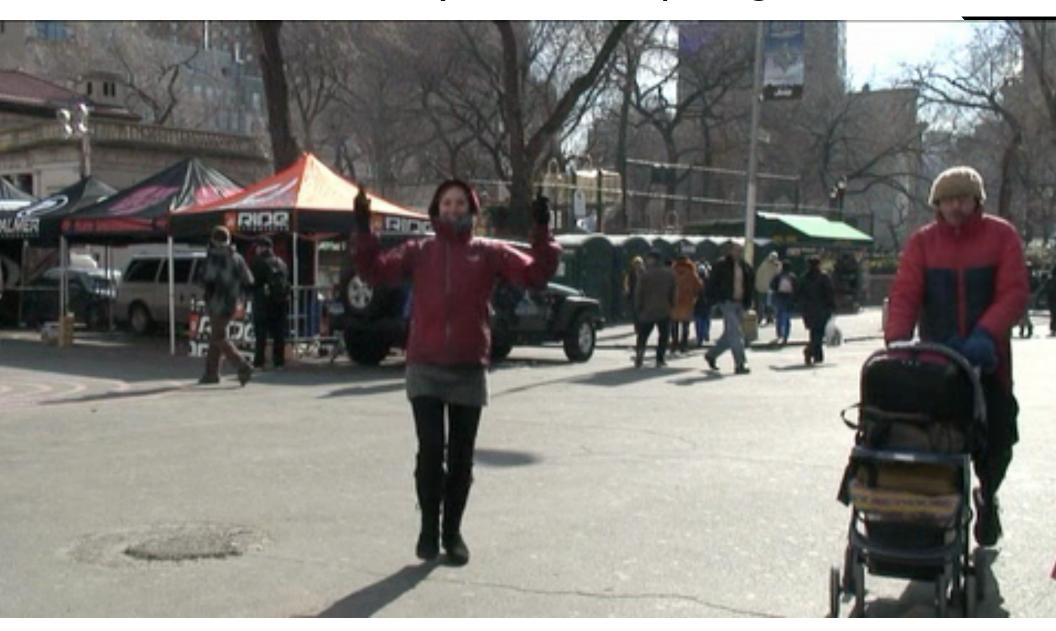
### Thermodynamic Computing



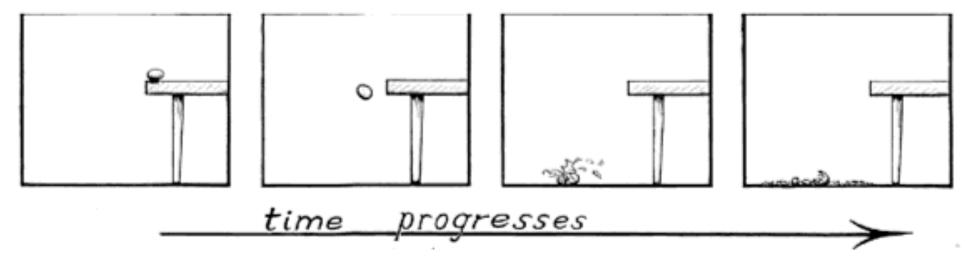
Forward Through Backwards Time by RocketBoom

### The 2nd Law of Thermodynamics

Clausius inequality (1865)

$$\Delta S_{\rm total} \ge 0$$

Total Entropy increases as time progresses



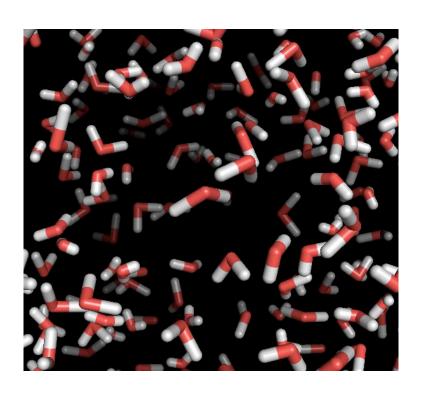
Cycles of time R.Penrose (2010)



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

## Thermodynamic Equilibrium: Future, past and present are indistinguishable





No change in entropy



### What is Entropy?

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

1 natural unit of entropyequivalent to1 kT of thermal energy

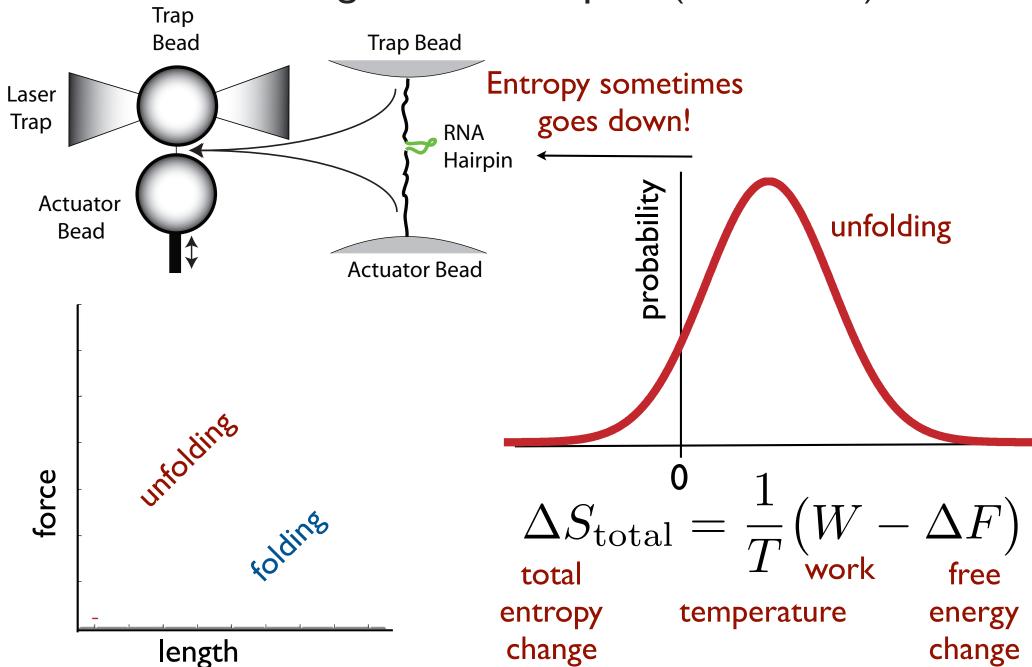
T: Temperature (ambient 300 Kelvin

k : Boltzmann's constant

I kT = 25 meV= 2.5 kJ/mol

average kinetic energy = 1.5 kT

### Unfolding of RNA hairpins. (circa 2000)



### The (improved) 2nd Law of Thermodynamics

Clausius inequality (1865)

Jarzynski identity (1997)

$$\langle \Delta S_{\rm total} \rangle \ge 0$$

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

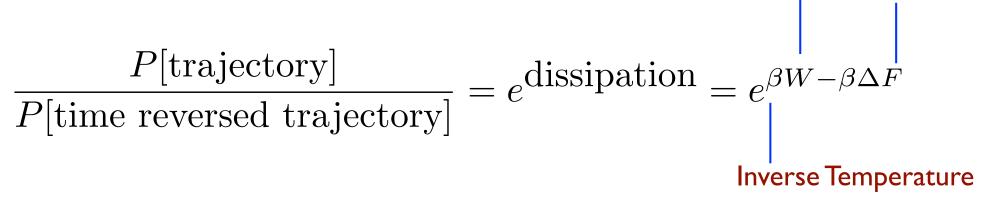
equality only for reversible process

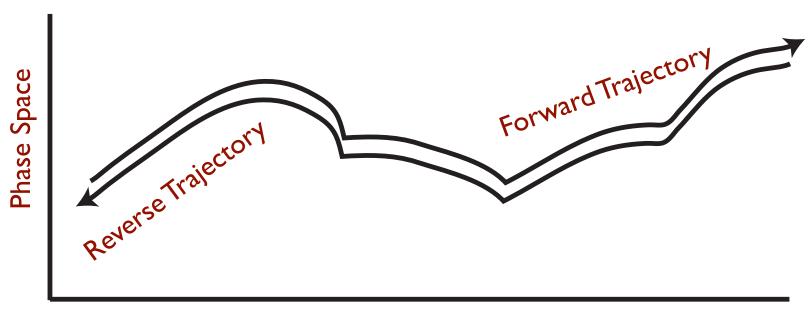
equality far-from-equilibrium

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

#### Fluctuation Theorems:

### Dissipation breaks time-reversal symmetry Work





Time

Free Energy

#### 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)
- The fluctuations matter
- Entropy change breaks time quantitatively reversal symmetry
- Directly relevant at small dissipation
- Information and entropy are related:
   Information flow is as important as work and heat flow.

### Experimental verification of Landauer's principle linking information and thermodynamics

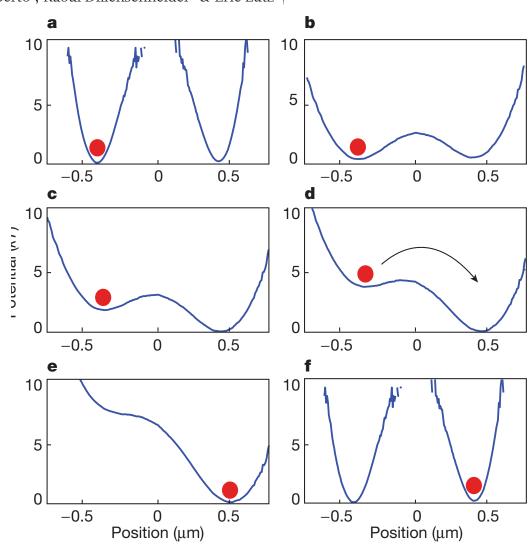
(2012)

Antoine Bérut<sup>1</sup>, Artak Arakelyan<sup>1</sup>, Artyom Petrosyan<sup>1</sup>, Sergio Ciliberto<sup>1</sup>, Raoul Dillenschneider<sup>2</sup> & Eric Lutz<sup>3</sup>†

Erasing I bit of information requires at least In 2 kT energy

Thermodynamic entropy and Shannon information are related

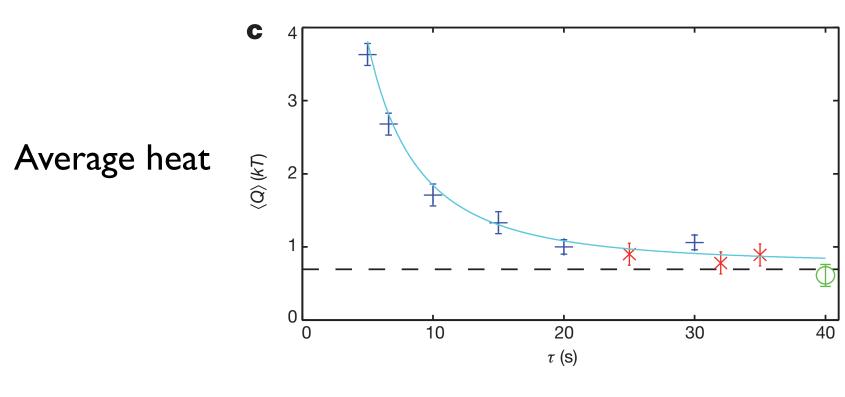
Bits are physical



Non-equilibrium Theory of erasure see: Esposito (2011)

### Experimental verification of Landauer's principle linking information and thermodynamics

Antoine Bérut<sup>1</sup>, Artak Arakelyan<sup>1</sup>, Artyom Petrosyan<sup>1</sup>, Sergio Ciliberto<sup>1</sup>, Raoul Dillenschneider<sup>2</sup> & Eric Lutz<sup>3</sup>†



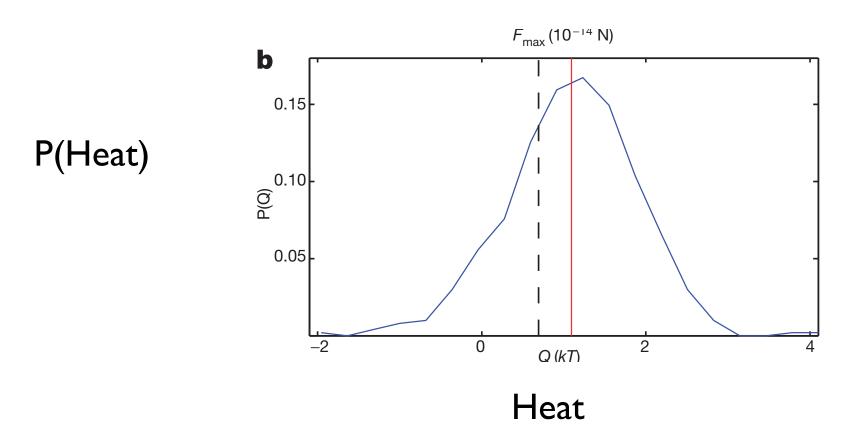
Erasure time

But: Thermodynamically reversible computation requires

Carnot limit, i.e. infinity long time

### Experimental verification of Landauer's principle linking information and thermodynamics

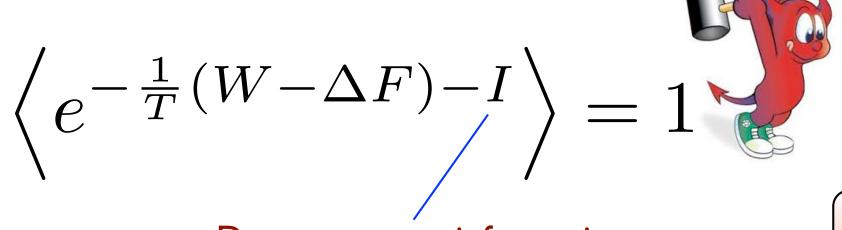
Antoine Bérut<sup>1</sup>, Artak Arakelyan<sup>1</sup>, Artyom Petrosyan<sup>1</sup>, Sergio Ciliberto<sup>1</sup>, Raoul Dillenschneider<sup>2</sup> & Eric Lutz<sup>3</sup>†



Fluctuations matter!
Tradeoff between error, time, and energy

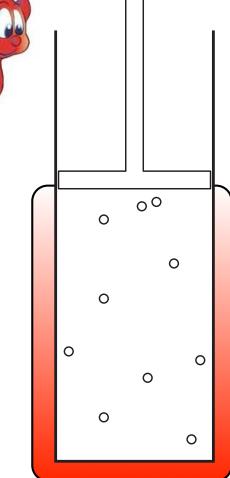
### Research Highlights

### Feedback Fluctuation Theorems (c2010)



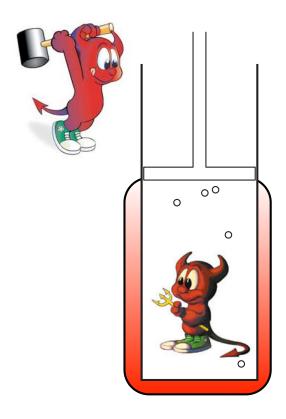
Demon-system information

Sagawa & Ueda (2008) Horowitz & Vaikuntanathan (2010)



### Research Highlights

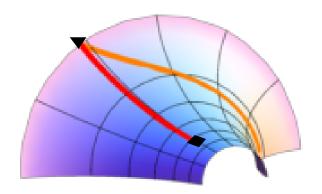
### Thermodynamics of Prediction



Still, Sivak, Bell, Crooks (2012)

### Research Highlights 1/2

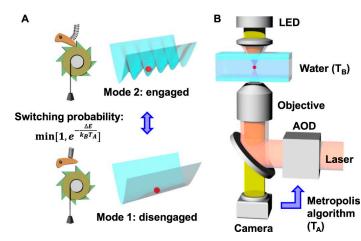
# Optimal thermodynamic control



#### Coupled Systems

### S Experiments





Feynman's ratchet Bang et al (2018)

### Research Highlights 2/2

time-dissipation-error tradeoff

Thermodynamics uncertainty realtions

Lahiri, Sohl-Dickstein, Ganguli (2016)

T. R. Gingrich, J. M. Horowitz, N. Perunov and J. L. England (2015)

Self-organization and the generation of complexity