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MARYLAND

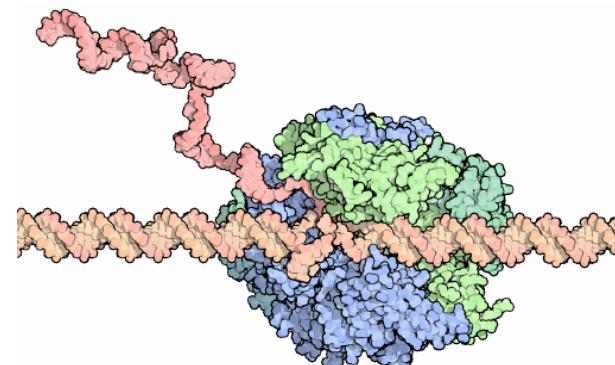
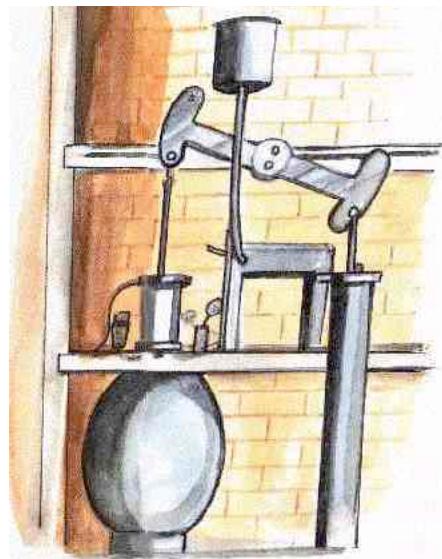
# Nonequilibrium thermodynamics at the microscale

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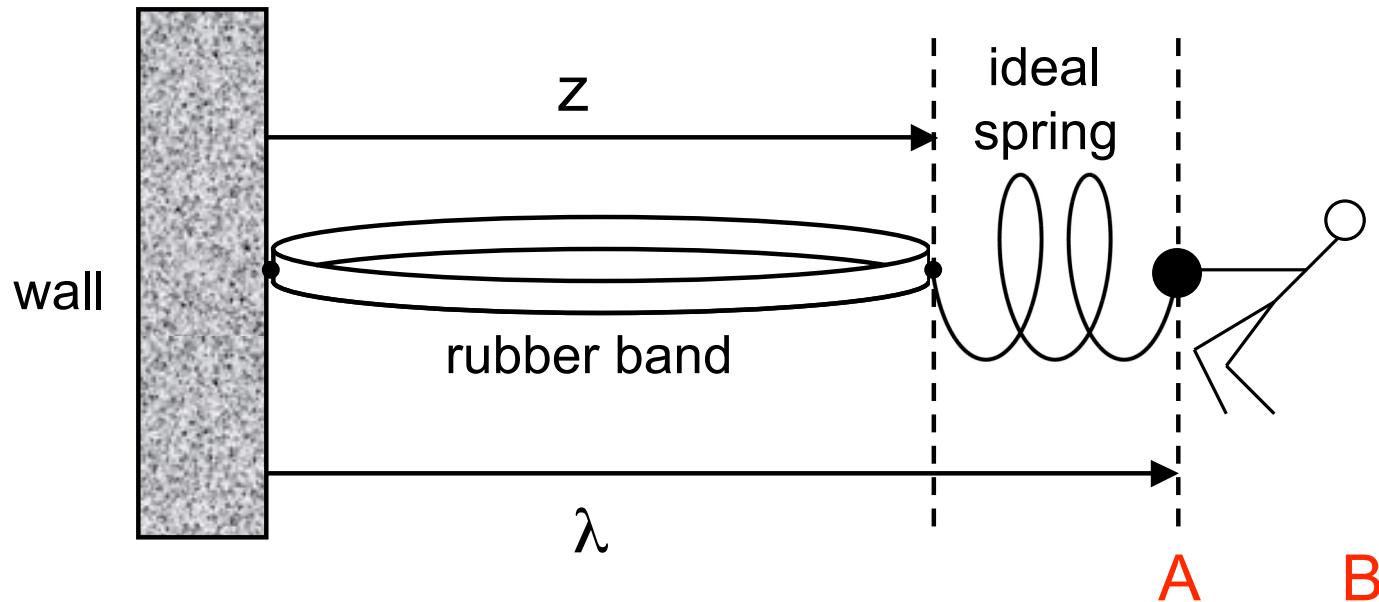
*and* Institute for Physical Science and Technology

~1 m



~20 nm

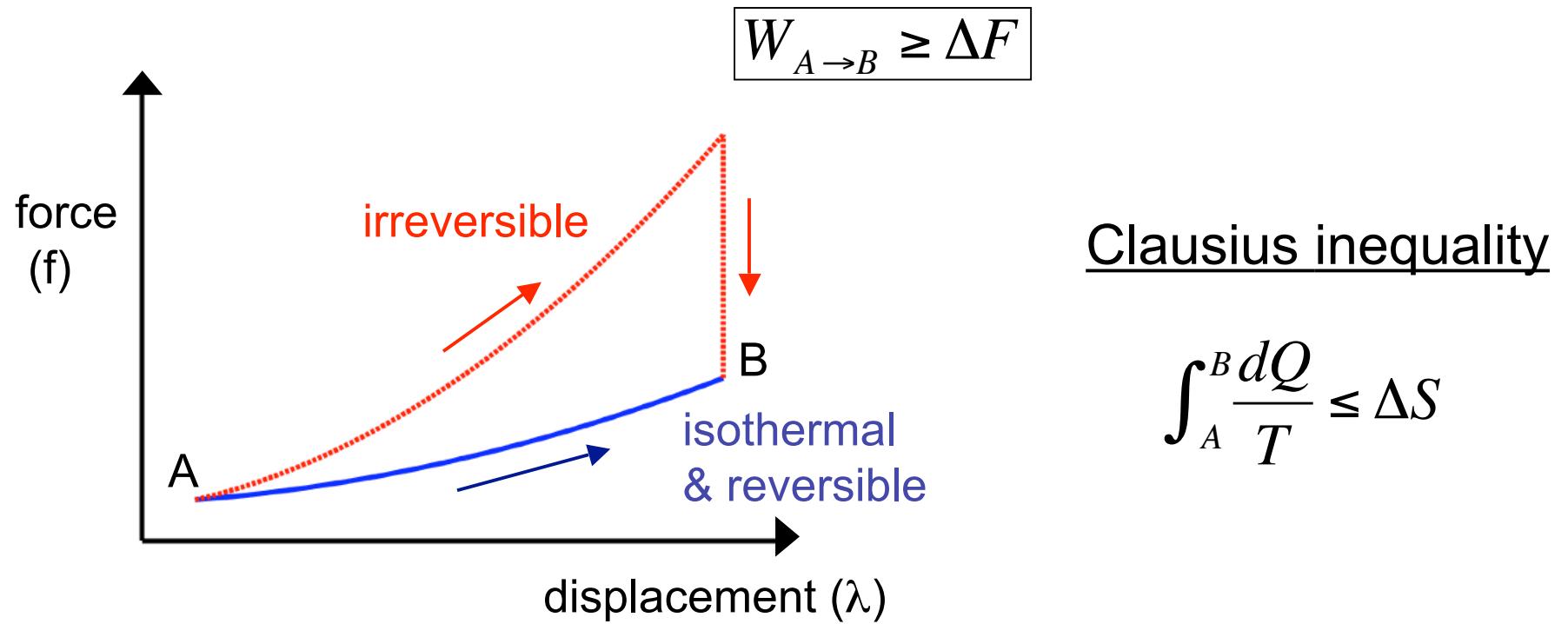
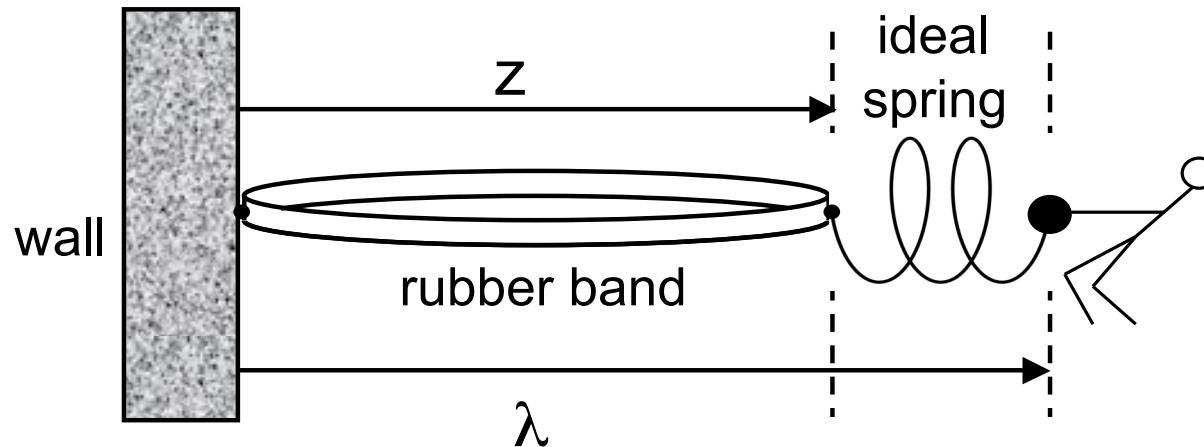
# Work and free energy: a macroscopic example ...



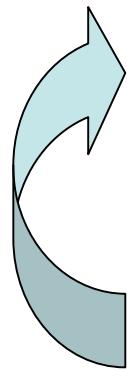
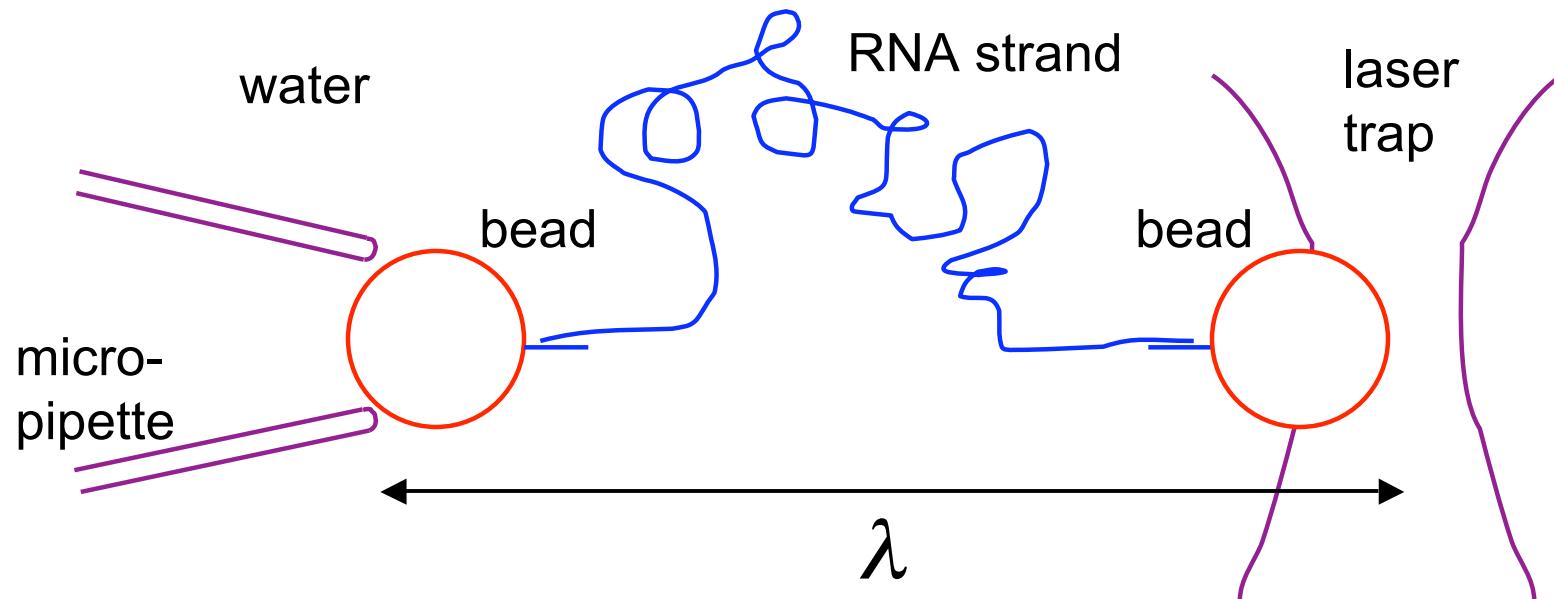
Irreversible process:

1. Begin in equilibrium  $\lambda = A$
2. Stretch the rubber band  $\lambda : A \rightarrow B$   
 $W = \text{work performed}$
3. End in equilibrium  $\lambda = B$

# Work and free energy: a macroscopic example ...



... and a microscopic analogue



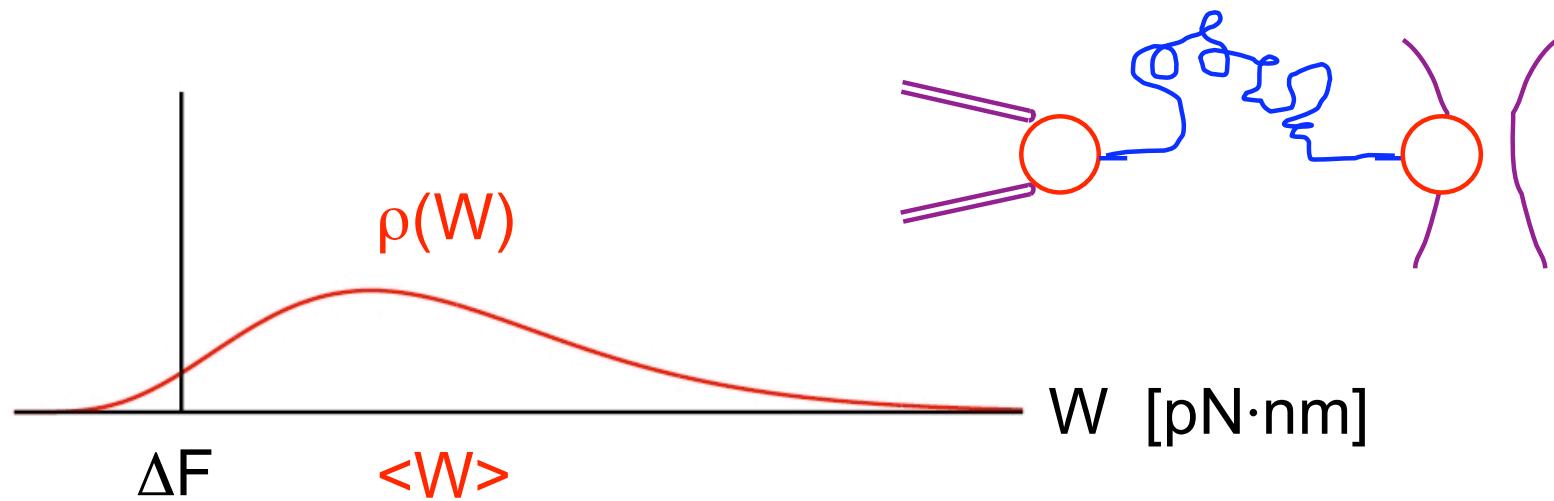
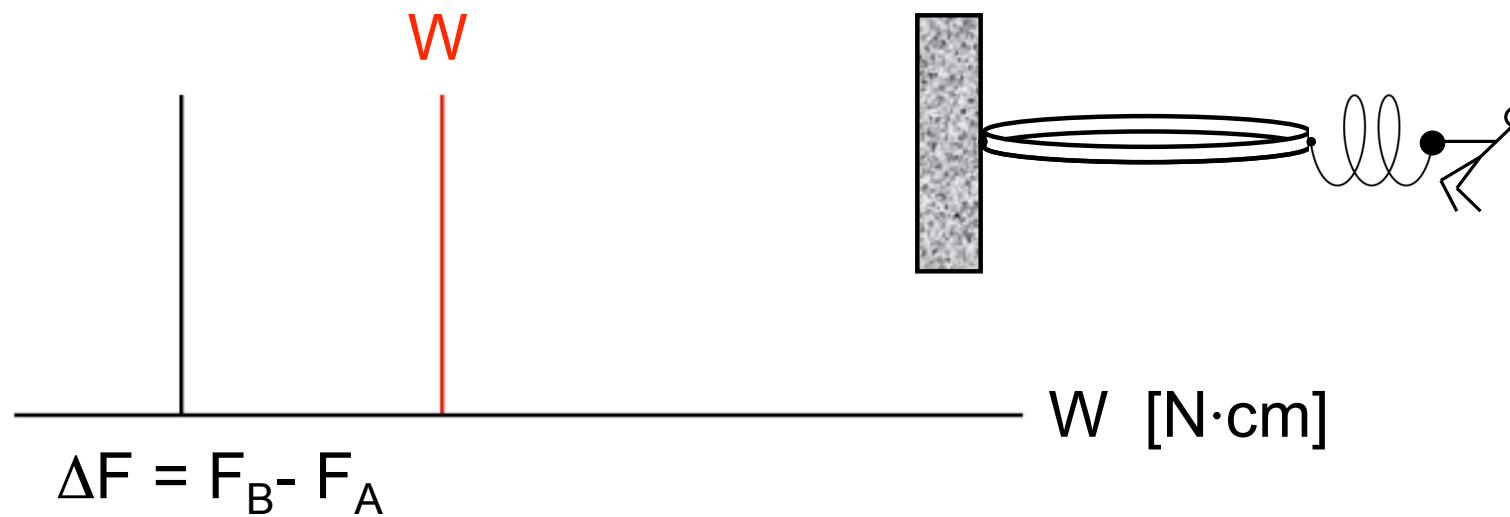
1. Begin in equilibrium
2. Stretch the molecule  
 $W = \text{work performed}$
3. End in equilibrium
4. Repeat

$$\begin{aligned}\lambda &= A \\ \lambda : A &\rightarrow B\end{aligned}$$

$$\lambda = B$$

*... fluctuations are now important !*

# Clausius inequality, *macro* & *micro*



## So what's new?

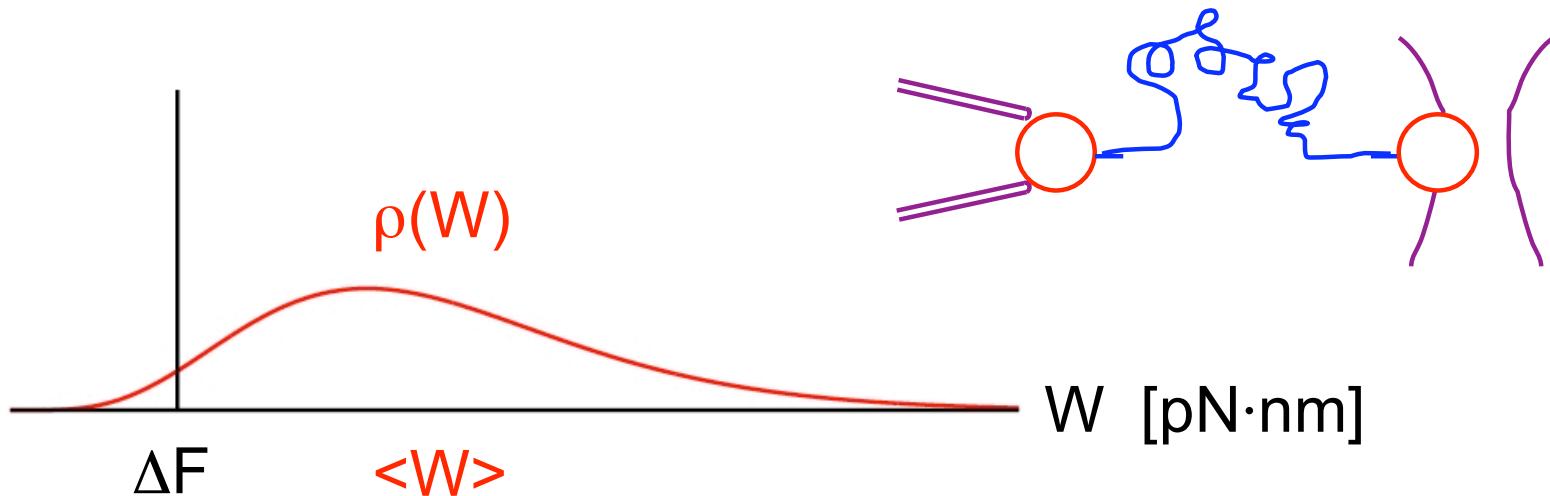
*Fluctuations in  $W$  satisfy strong and unexpected laws.*

e.g.

$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta F}$$

C.J., PRL 1997

... places a strong constraint on the work distribution

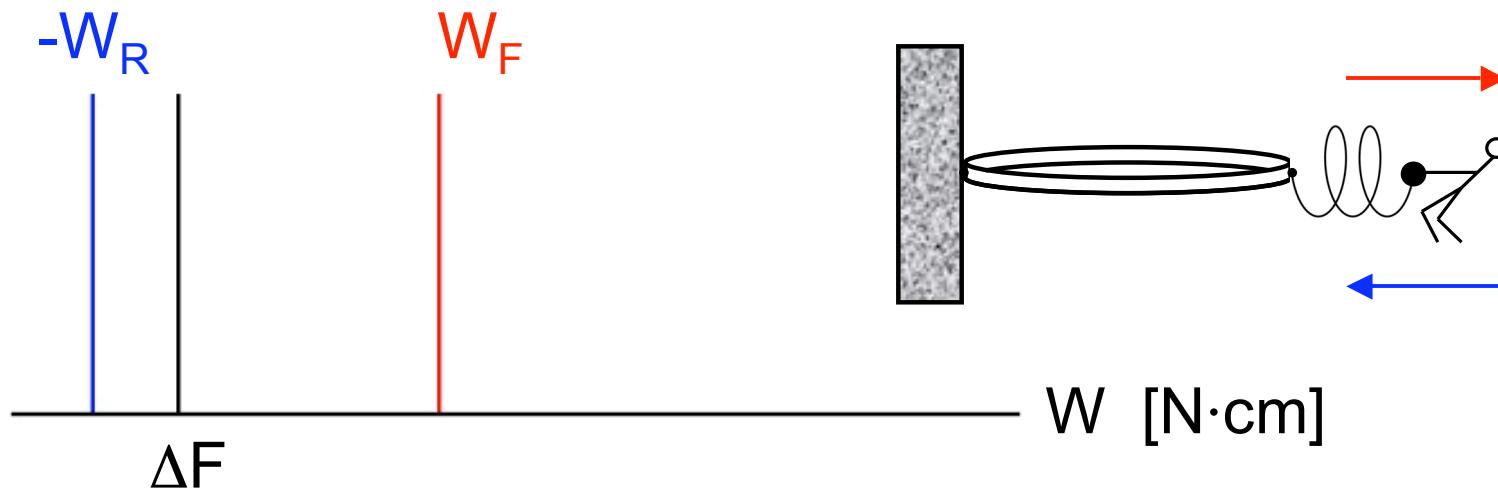


# Thermodynamic cycles

*forward process : A→B*

*reverse process : A←B*

$$W_R \geq -\Delta F$$

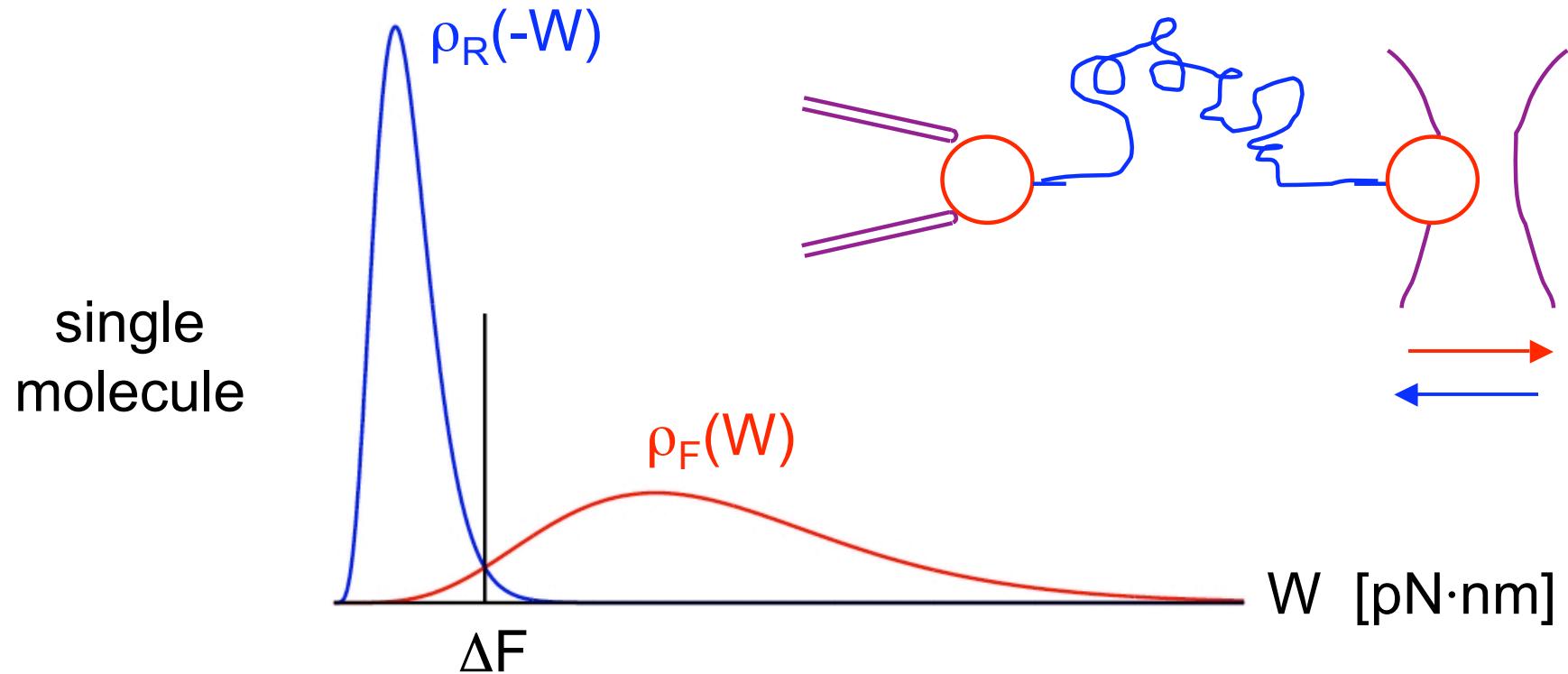


Kelvin-Planck statement of 2nd Law:  $W_F + W_R \geq 0$

We perform more work during the forward half-cycle ( $A \rightarrow B$ )  
than we recover during the reverse half-cycle ( $A \leftarrow B$ ).

(no free lunch)

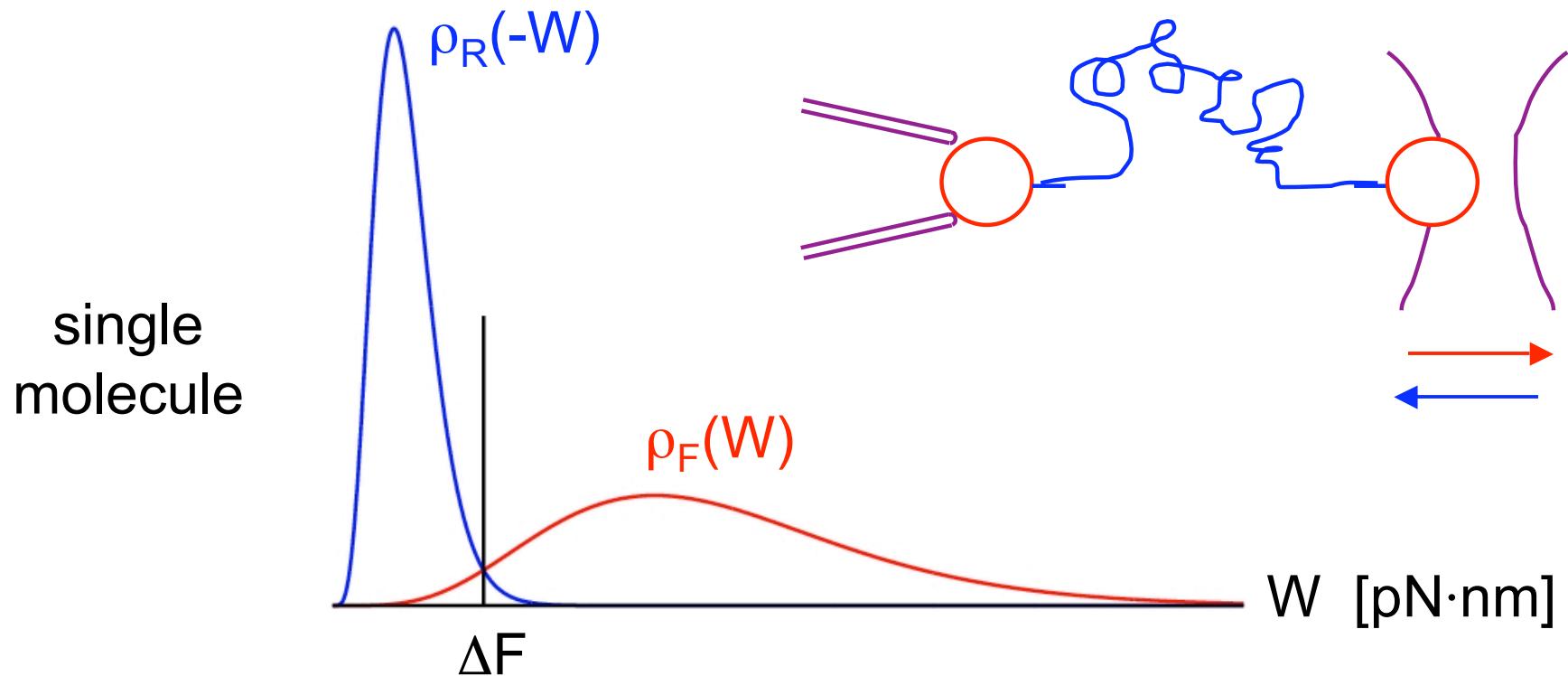
At the microscopic level :



Kelvin-Planck statement of 2nd Law:  $\langle W \rangle_F + \langle W \rangle_R \geq 0$

(no free lunch... *on average*)

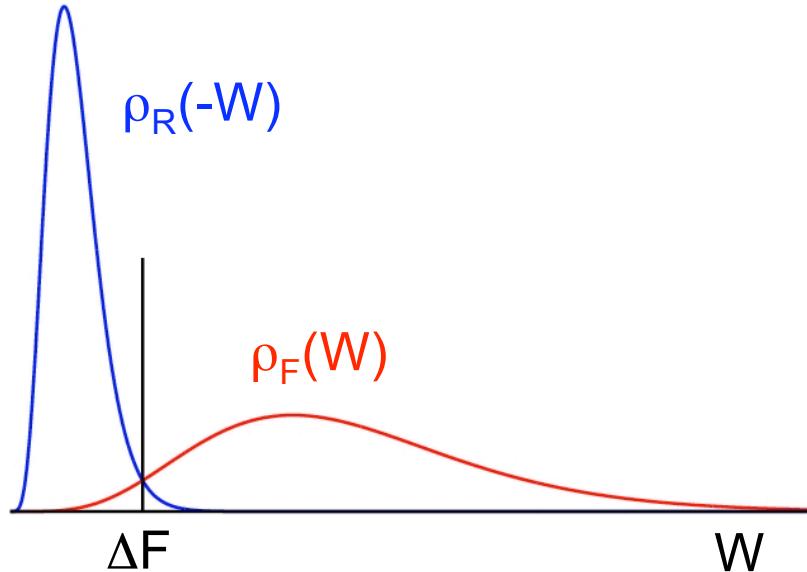
At the microscopic level :



$$\frac{\rho_F(+W)}{\rho_R(-W)} = \exp[\beta(W - \Delta F)]$$

G.E. Crooks, PRE 1999

# Nonequilibrium work relations



$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta F}$$

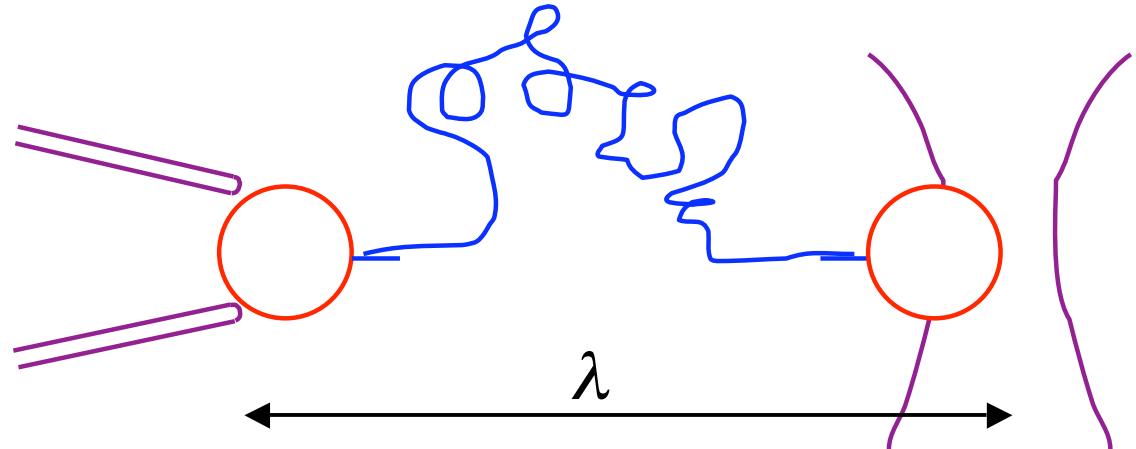
$$\frac{\rho_F(+W)}{\rho_R(-W)} = \exp[\beta(W - \Delta F)]$$

& others ...

Bustamante, Liphardt, & Ritort,  
*Physics Today*, 2005

- how they are derived
- what they are good for
- what they reveal about irreversibility

## Derivation (isolated system)



microstate  
Hamiltonian

$$x \\ H(x; \lambda)$$

positions, momenta  
internal energy

In equilibrium ...

$$p^{eq}(x; \lambda) = \frac{1}{Z_\lambda} e^{-\beta H(x; \lambda)}$$

Boltzmann-Gibbs distribution

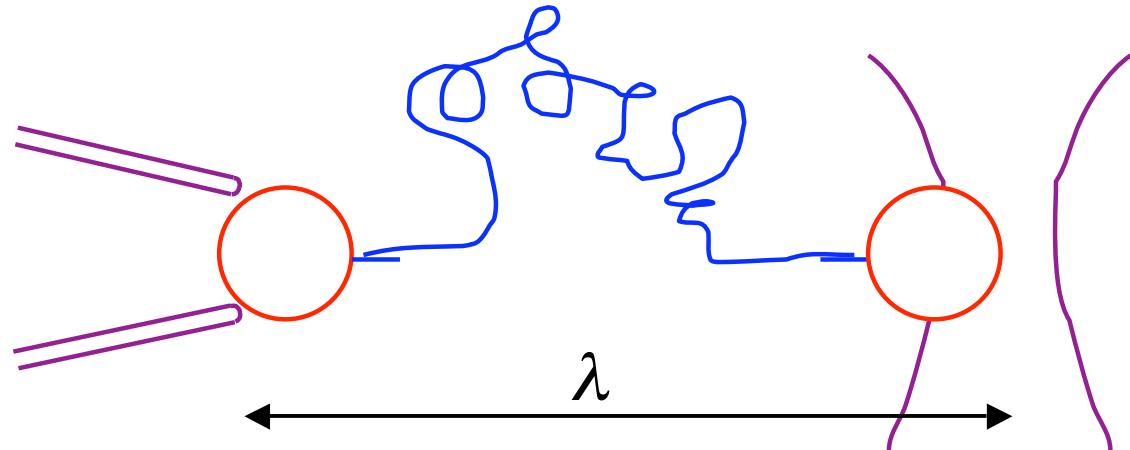
$$Z_\lambda = \int dx e^{-\beta H(x; \lambda)}$$

partition function

$$F_\lambda = -\beta^{-1} \ln Z_\lambda$$

free energy

## Derivation (isolated system)



One realization ...

$0 \leq t \leq \tau$	<i>protocol</i>	$\lambda_t$	how we act on the system
	<i>trajectory</i>	$x_t$	how the system responds
	<i>work</i>	$W = H(x_\tau; B) - H(x_0; A)$	
1st law : $\Delta E = W + Q$			$\cancel{Q}$

... now just compute average of  $e^{-\beta W}$  over many realizations



$$W(x_0) = H(x_\tau(x_0); B) - H(x_0; A)$$

$$\langle e^{-\beta W} \rangle = \int dx_0 \frac{1}{Z_A} e^{-\beta H(x_0; A)} e^{-\beta W(x_0)}$$

$$= \frac{1}{Z_A} \int dx_0 e^{-\beta H(x_\tau(x_0); B)}$$

$$= \frac{1}{Z_A} \int dx_\tau \left| \frac{\partial x_\tau}{\partial x_0} \right|^{-1} e^{-\beta H(x_\tau; B)}$$

$$= \frac{Z_B}{Z_A} = e^{-\beta \Delta F}$$

*QED*

# Various derivations

- C.J. PRL & PRE 1997, J Stat Mech 2004
- G.E. Crooks J Stat Phys 1998, PRE 1999, 2000
- J. Kurchan cond-mat 2000
- G. Hummer & A. Szabo PNAS 2001
- T. Hatano & S.I. Sasa PRL 2001
- S.X. Sun J Chem Phys 2003
- D. J. Evans Mol Phys 2003
- S. Mukamel PRL 2003
- H. Oberhofer, C. Dellago, P. Geissler J Phys Chem B 2005
- A. Imparato & L. Peliti Europhys Lett 2005
- U. Seifert PRL 2005 ...

Hamiltonian evolution, Markov processes, Langevin dynamics,  
deterministic thermostats, quantum dynamics ... *robust*

see also: G.N. Bochkov & Y.E. Kuzovlev JETP 1977

skepticism: E.G.D. Cohen & D. Mauzerall J Stat Mech 2004

J. Sung PRE 2005

J.M.G. Vilar & J.M Rubi PRL 2008

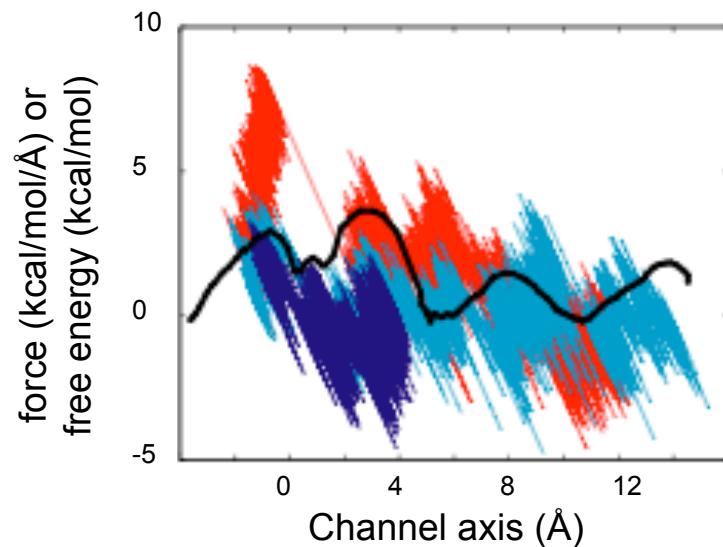
# Free energy calculations

use nonequilibrium simulations to estimate equilibrium free energy differences in complex systems

e.g. *potentials of mean force*

Hummer & Szabo, PNAS (2001)  
Park & Schulten, J Chem Phys (2004)

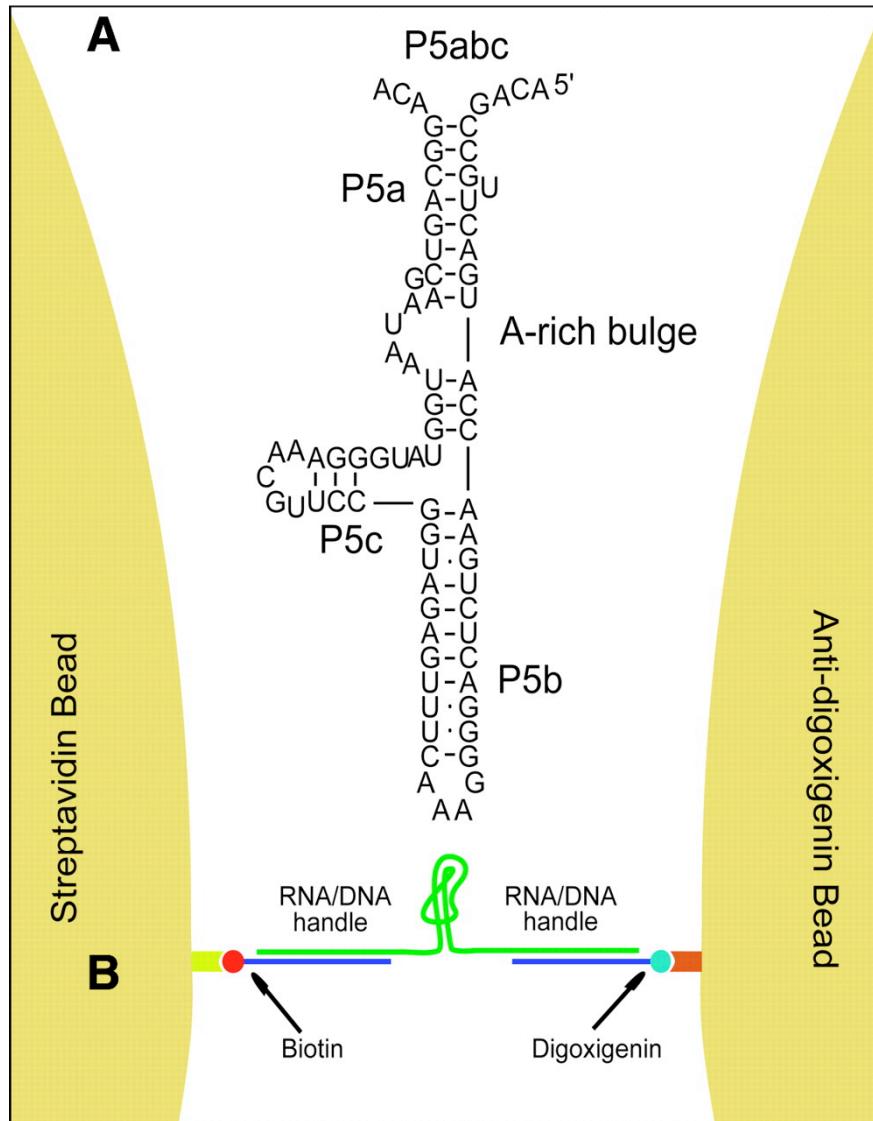
nonequilibrium trajectories + statistical weights  $\exp(-\beta w)$   
=  
equilibrium information



example: conduction of ammonia through a barrel-like protein

R. Amaro & Z. Luthey-Schulten,  
*Chem Phys* **307**, 147-155 (2004)

# Single-molecule experiments



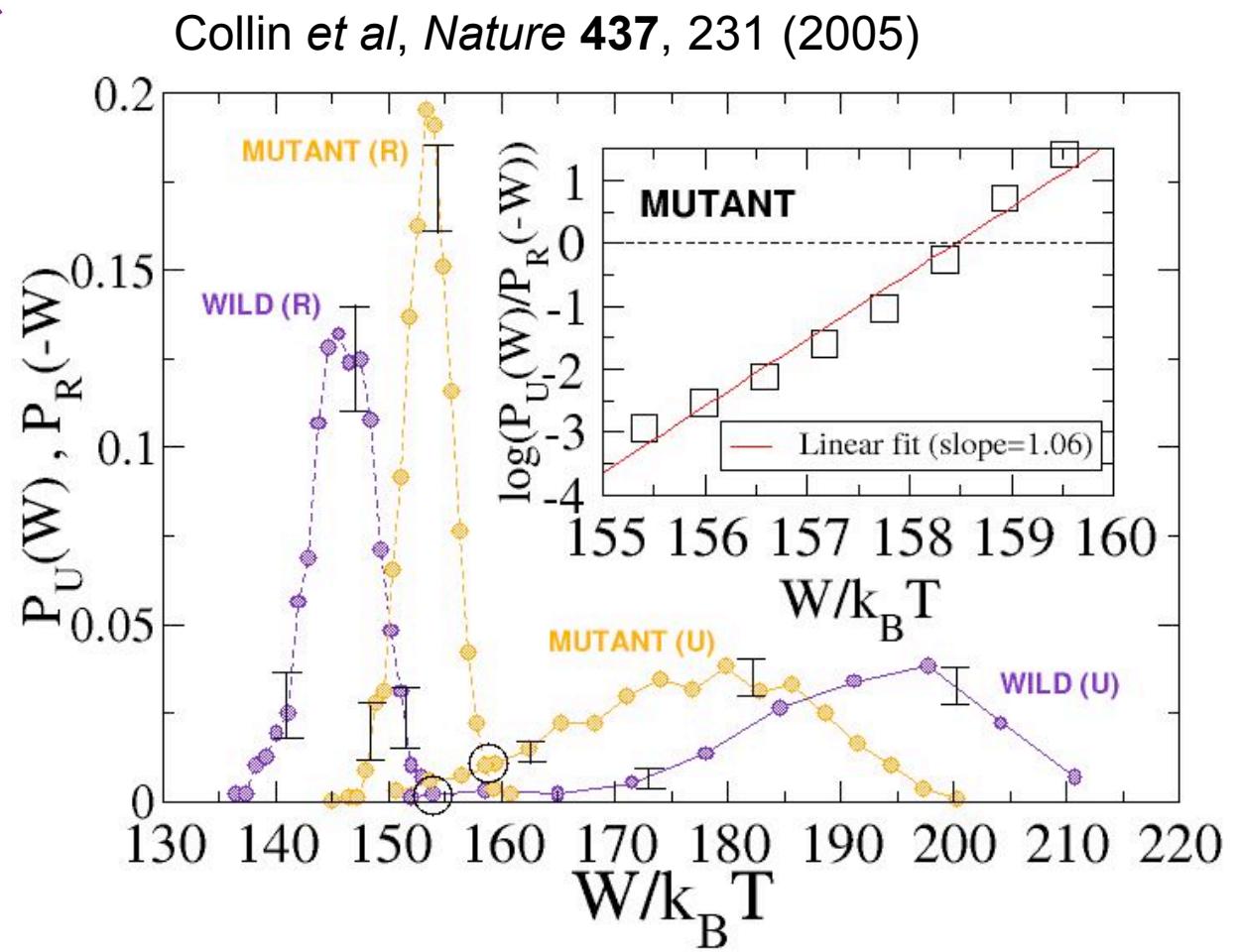
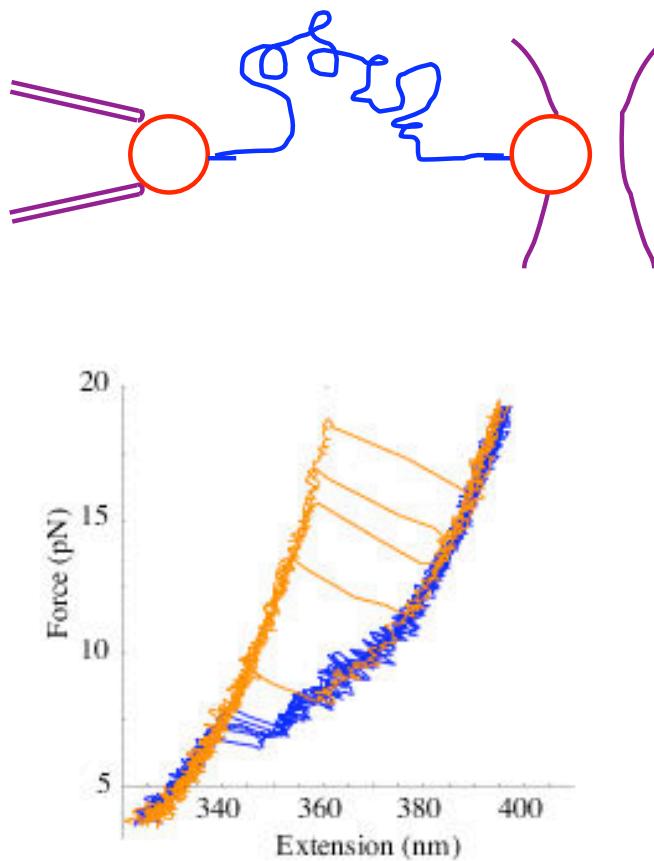
$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta F}$$

Liphardt, Dumont, Smith, Tinoco,  
and Bustamante  
*Science* **296**, 1832-1835 (2002)

experimental confirmation  
that equilibrium free energy  
differences can be obtained  
from nonequilibrium work values

# Unfolding & refolding of ribosomal RNA

$$\frac{\rho_{unfold}(+W)}{\rho_{refold}(-W)} = \exp[\beta(W - \Delta F)]$$



# Further experimental tests

- optically trapped colloids

Wang *et al*, *Phys Rev Lett* **89**, 050601 (2002)

Blickle *et al*, *Phys Rev Lett* **96**, 070603 (2006)

- single-molecule unfolding of *titin*

Harris, Song, and Kiang, *Phys Rev Lett* **99**, 068101 (2007)

- torsional pendulum

Douarche *et al*, *Europhys Lett* **70**, 593 (2005)

*J Stat Mech* P09011 (2005)

- other systems?

magnetic nanoparticles?

trapped cold ions?

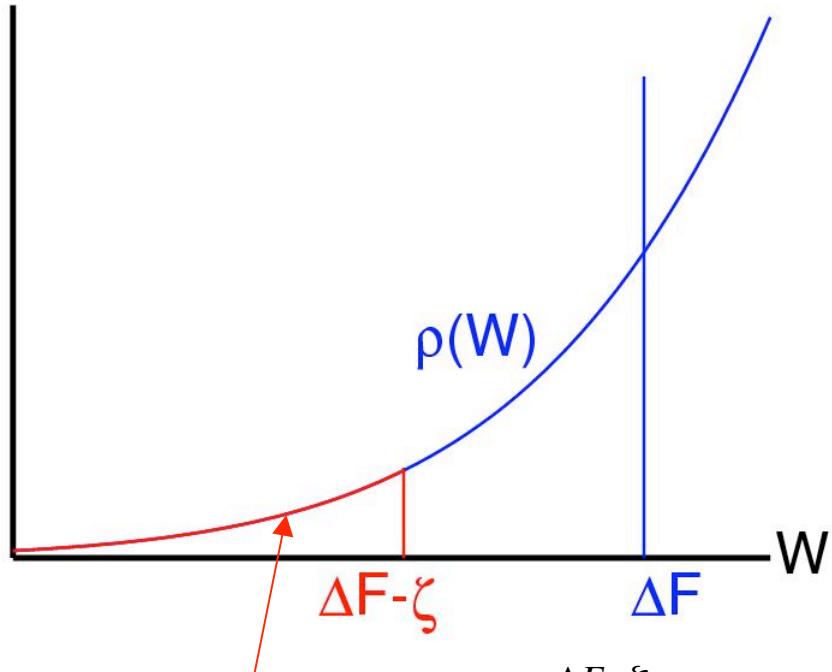
quantum effects?

# Irreversibility in microscopic systems

Jensen's inequality

$$\left. \begin{aligned} \langle e^{-\beta W} \rangle &= e^{-\beta \Delta F} \\ \langle e^x \rangle &\geq e^{\langle x \rangle} \end{aligned} \right\} \rightarrow \langle W \rangle \geq \Delta F$$

(Clausius inequality)



What is the probability that the 2nd law will be “violated” by at least  $\zeta$  units of energy?

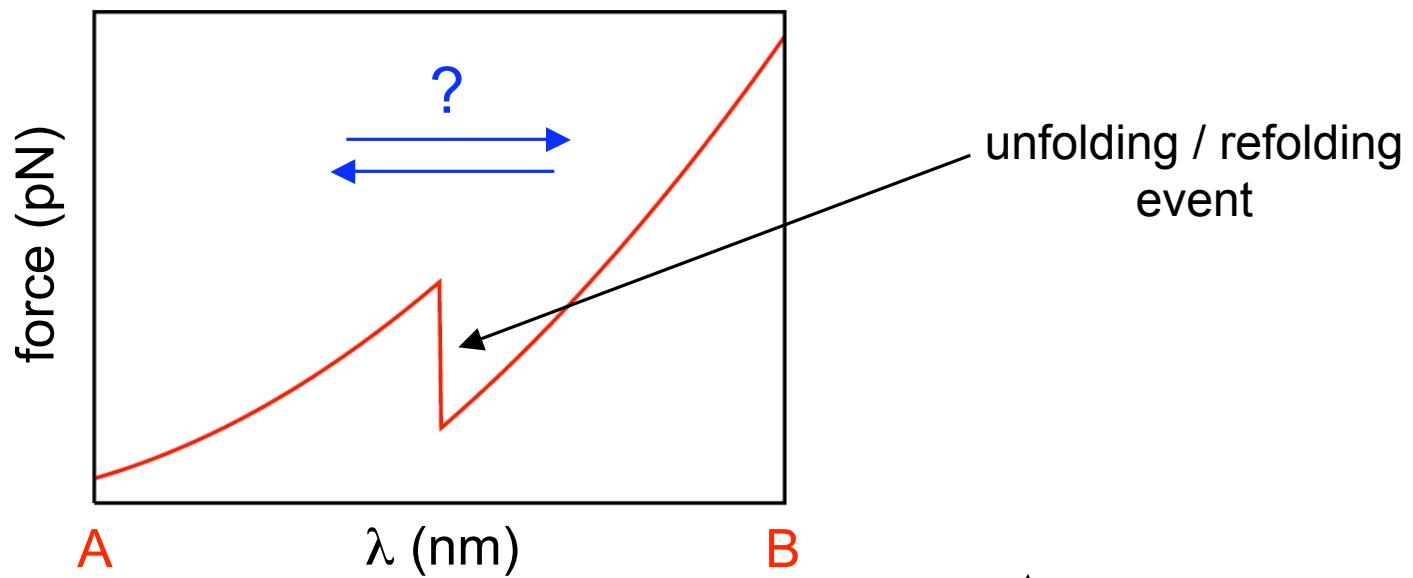
$$\begin{aligned} P[W < \Delta F - \zeta] &= \int_{-\infty}^{\Delta F - \zeta} dW \rho(W) \leq \int_{-\infty}^{\Delta F - \zeta} dW \rho(W) e^{\beta(\Delta F - \zeta - W)} \\ &\leq e^{\beta(\Delta F - \zeta)} \int_{-\infty}^{+\infty} dW \rho(W) e^{-\beta W} = \exp(-\zeta/kT) \end{aligned}$$

# Guessing the direction of the arrow of time

You are shown a movie depicting a thermodynamic process, A→B.

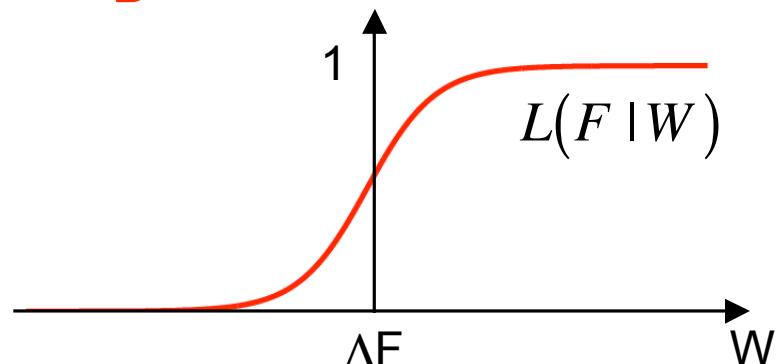
Task: determine whether you are viewing the events in the order in which they actually occurred, or a movie run backward of the reverse process.

e.g.

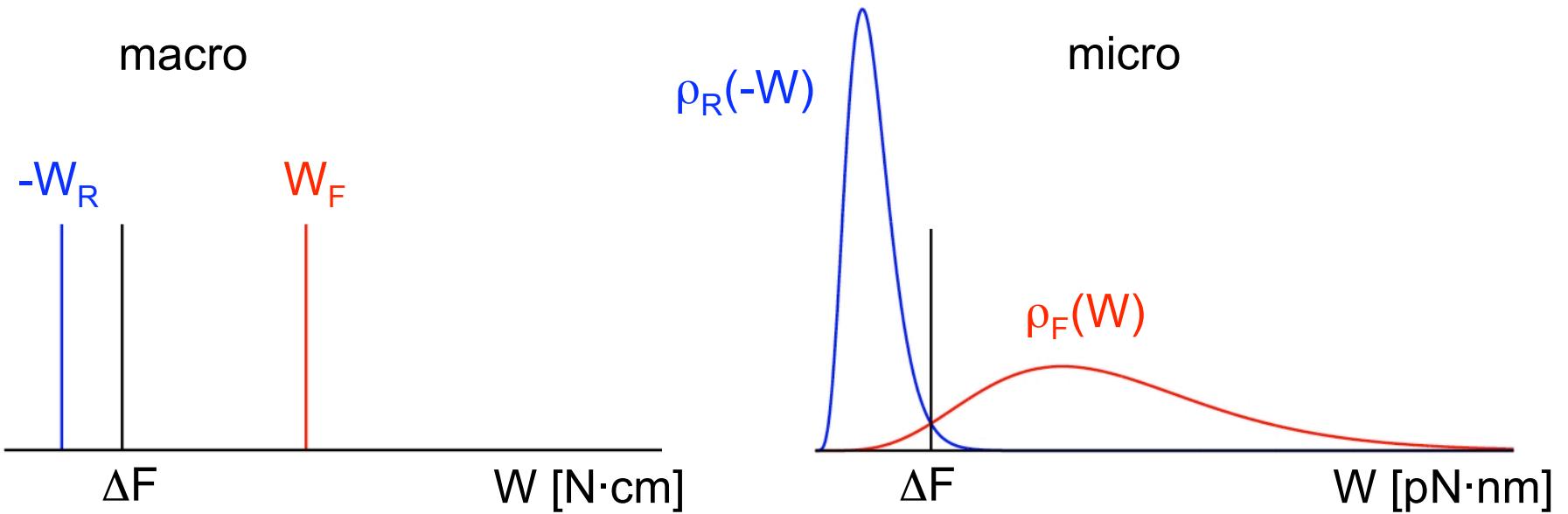


$$L(F | W) = \frac{1}{1 + \exp[-\beta(W - \Delta F)]}$$

~ Shirts *et al*, PRL 2003 ,  
Maragakis *et al*, J Chem Phys 2008



# Summary



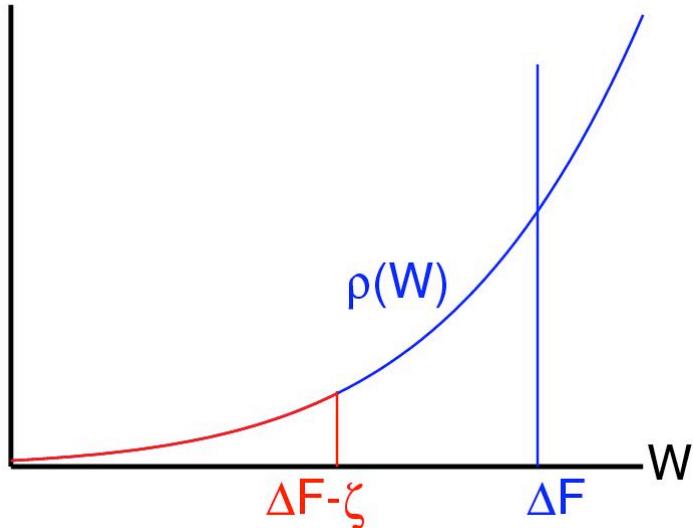
$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta F} , \quad \frac{\rho_F(+W)}{\rho_R(-W)} = \exp[\beta(W - \Delta F)] , \quad \text{& others}$$

Nonequilibrium work fluctuations:

- satisfy strong constraints
- encode equilibrium information
- irreversibility in microscopic systems

# Irreversibility in microscopic systems

$$\langle e^{-\beta W} \rangle = e^{-\beta \Delta F} \quad \text{implies} \quad \begin{cases} \langle W \rangle \geq \Delta F & \text{(Clausius inequality)} \\ P[W < \Delta F - \zeta] \leq \exp(-\zeta/kT) \end{cases}$$



What is the probability that the 2nd law will be “violated” by at least  $\zeta$  units of energy?

*guessing the arrow of time*

characteristic transition from  
“almost certainly F” to “almost certainly R”

see also:

Kawai, Parrondo, van den Broeck PRL 2007

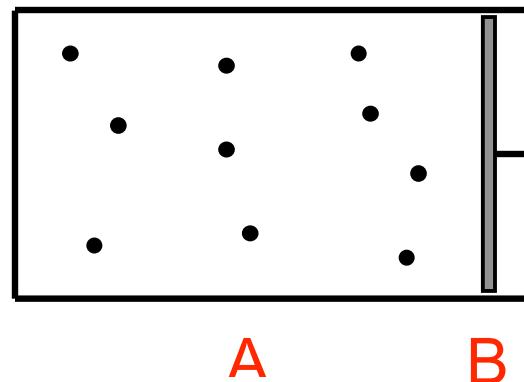
$$L(F|W) = \frac{1}{1 + \exp\left(-\frac{W - \Delta F}{kT}\right)}$$

~ Shirts et al, PRL 2003

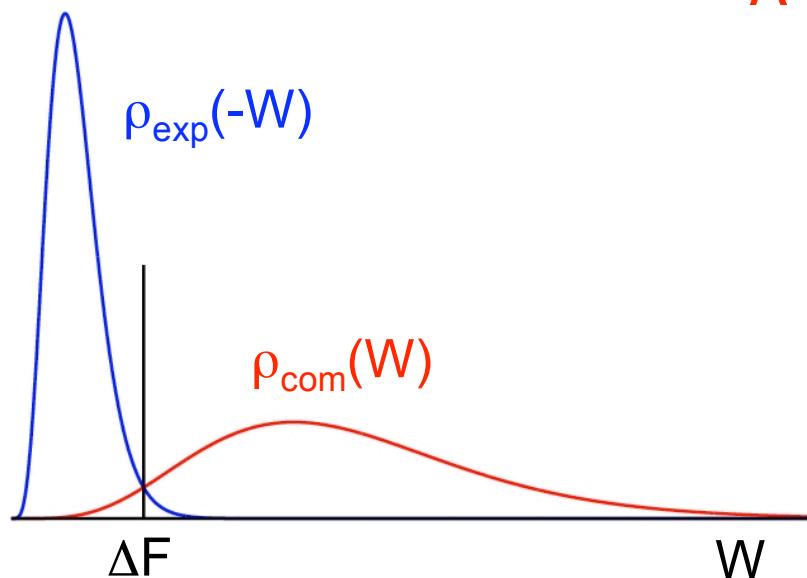
# Exactly solvable model: Compression /expansion of dilute classical gas

Crooks & Jarzynski, PRE 2007

$n_p$  interacting  
particles,  
initial temperature  $T$



slow compression,  
no heat bath



$$\rho(W) = \frac{\beta}{\alpha \Gamma(k)} \left(\frac{\beta W}{\alpha}\right)^{k-1} \exp\left(-\frac{\beta W}{\alpha}\right) \theta(W)$$

$$\alpha = (V_B/V_A)^{2/3} - 1$$

$$k = 3n_p/2$$