



Even if you're not burning books,  
destroying information generates heat.

# **Information and Thermodynamics: Experimental verification of Landauer's erasure principle with a colloidal particle**

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Nature 483, 187-189 (2012)

- The fundamental laws of Thermodynamics
- Landauer's principle
- How to realise it ?
- Experimental set-up
- Data analysis
- Comparison with numerical results
- Conclusions

# Main Laws of Thermodynamics I

The **First Law of Thermodynamics** is a version of the **Law of Conservation of Energy**



Clausius

Clausius statement of **the First Law**

*In a thermodynamic process, the increment in the internal energy of a system is equal to the difference between the heat exchanged by the system with the heat bath and the increment of work done on it.*

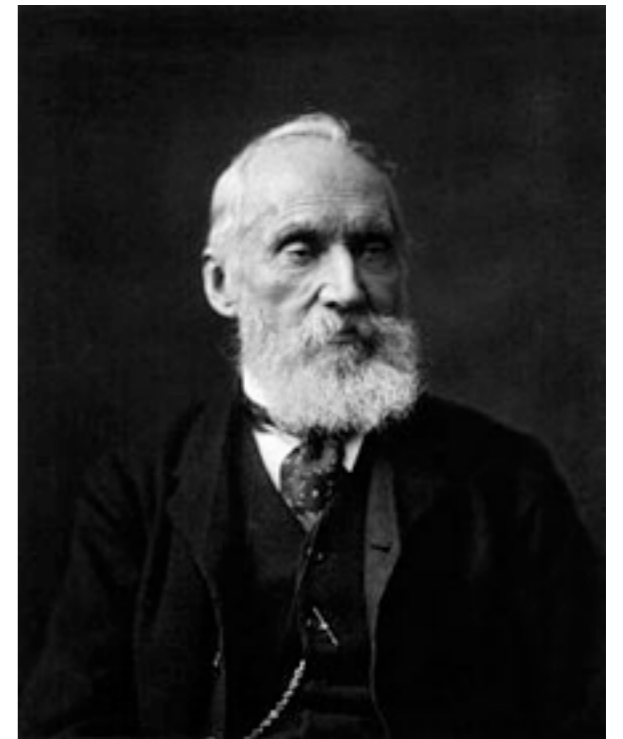
$$\Delta U_{A,B} = W_{A,B} - Q$$

## Main Laws of Thermodynamics II

**The Second Law** is a statement about irreversibility.

It is usually stated in physical terms of impossible processes.

Sadi Carnot was the first to give a formulation of this principle



Lord Kelvin Statement of **the Second Law**

Lord Kelvin

*No process is possible in which the sole result is the absorption of heat from a reservoir and its complete conversion into work.*

# Main Laws of Thermodynamics III

The **Second Law of Thermodynamics** is related to the concept of **Entropy**

$$\Delta S = \frac{Q}{T}$$

$$\Delta S_{tot} \geq 0$$

# Main Laws of Thermodynamics III

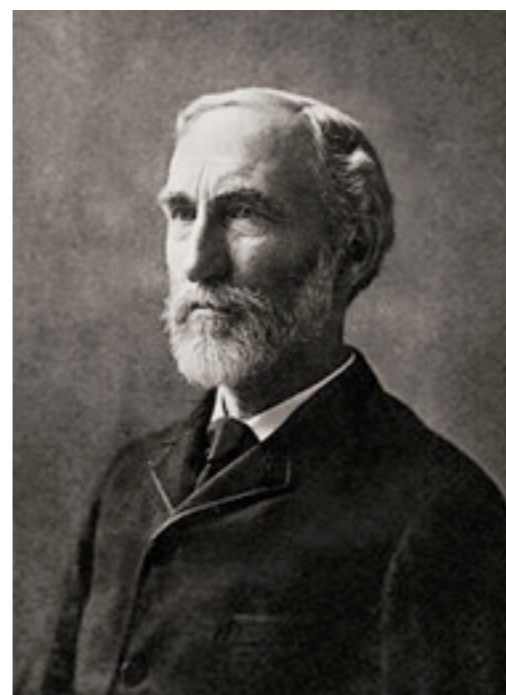
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In **statistical mechanics**, **Entropy** is related to the probability of the microstates, corresponding to a particular macrostate:

$$S = -k_B \sum_i p_i \log p_i$$



Gibbs



Boltzmann

# Main Laws of Thermodynamics III

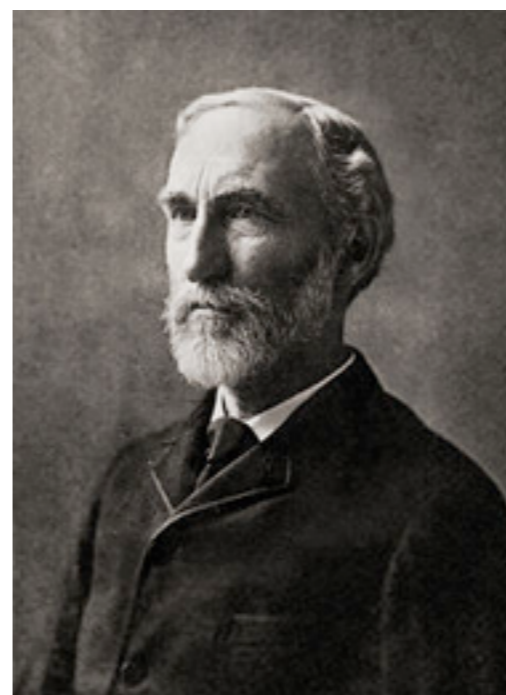
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Similar to Shannon entropy



# Main Laws of Thermodynamics III

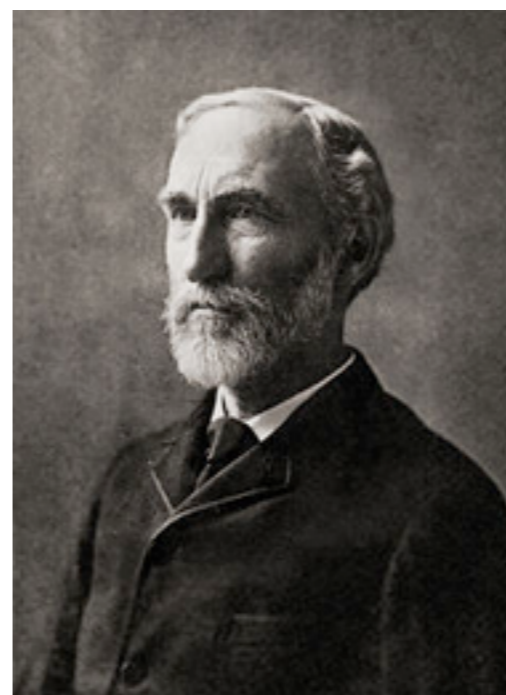
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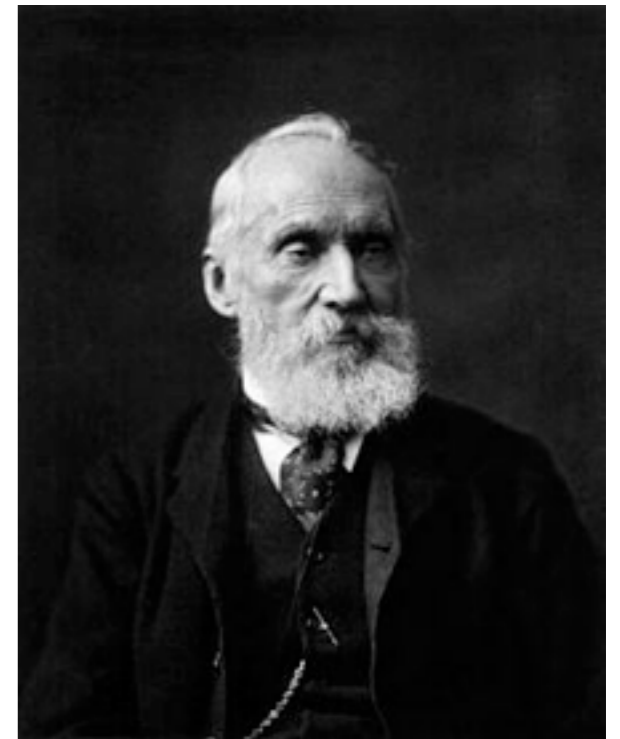
**Question : is Thermodynamic entropy the same that information entropy ?**

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Lord Kelvin Statement of **the Second Law**

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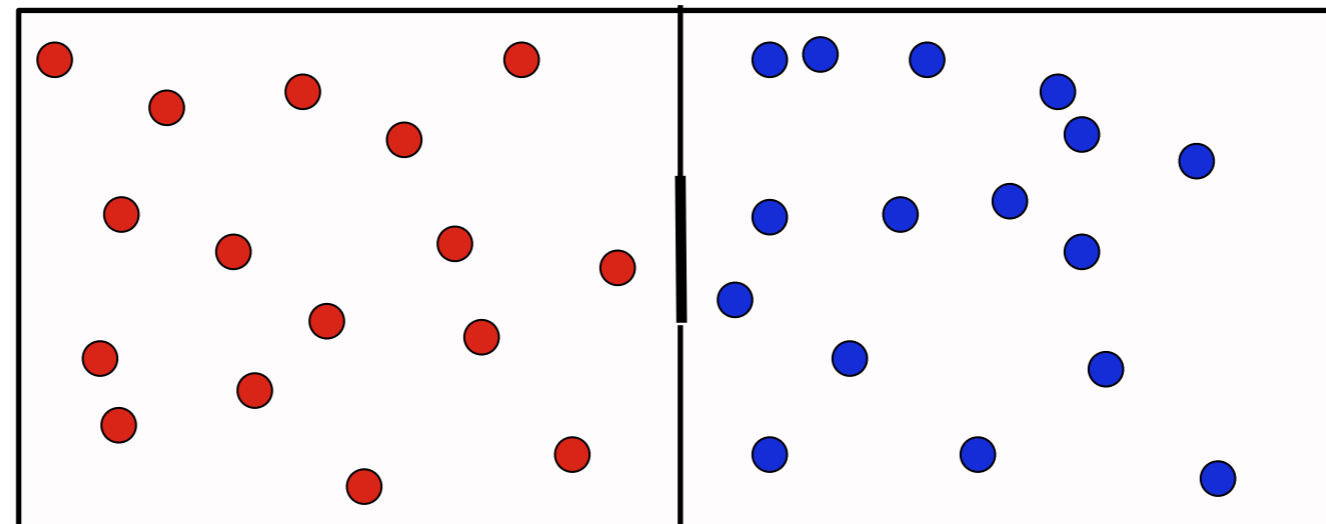
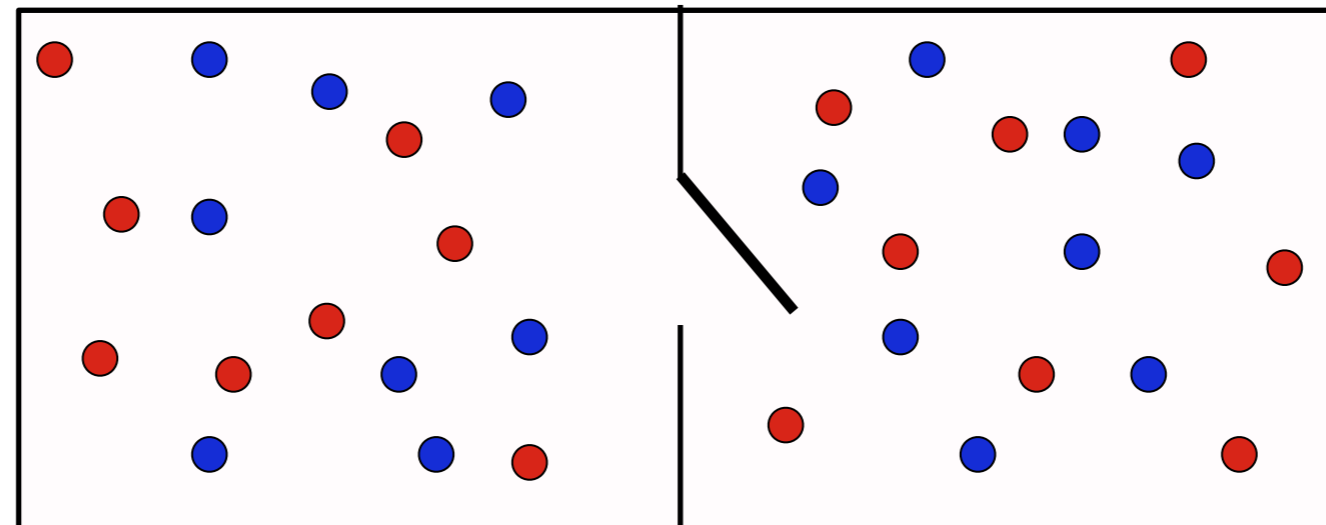
*No process is possible in which the sole result is the absorption of heat from a reservoir and its complete conversion into work.*

# Landauer's Principle and The Maxwell's Demon



A

B



- **slow molecules**

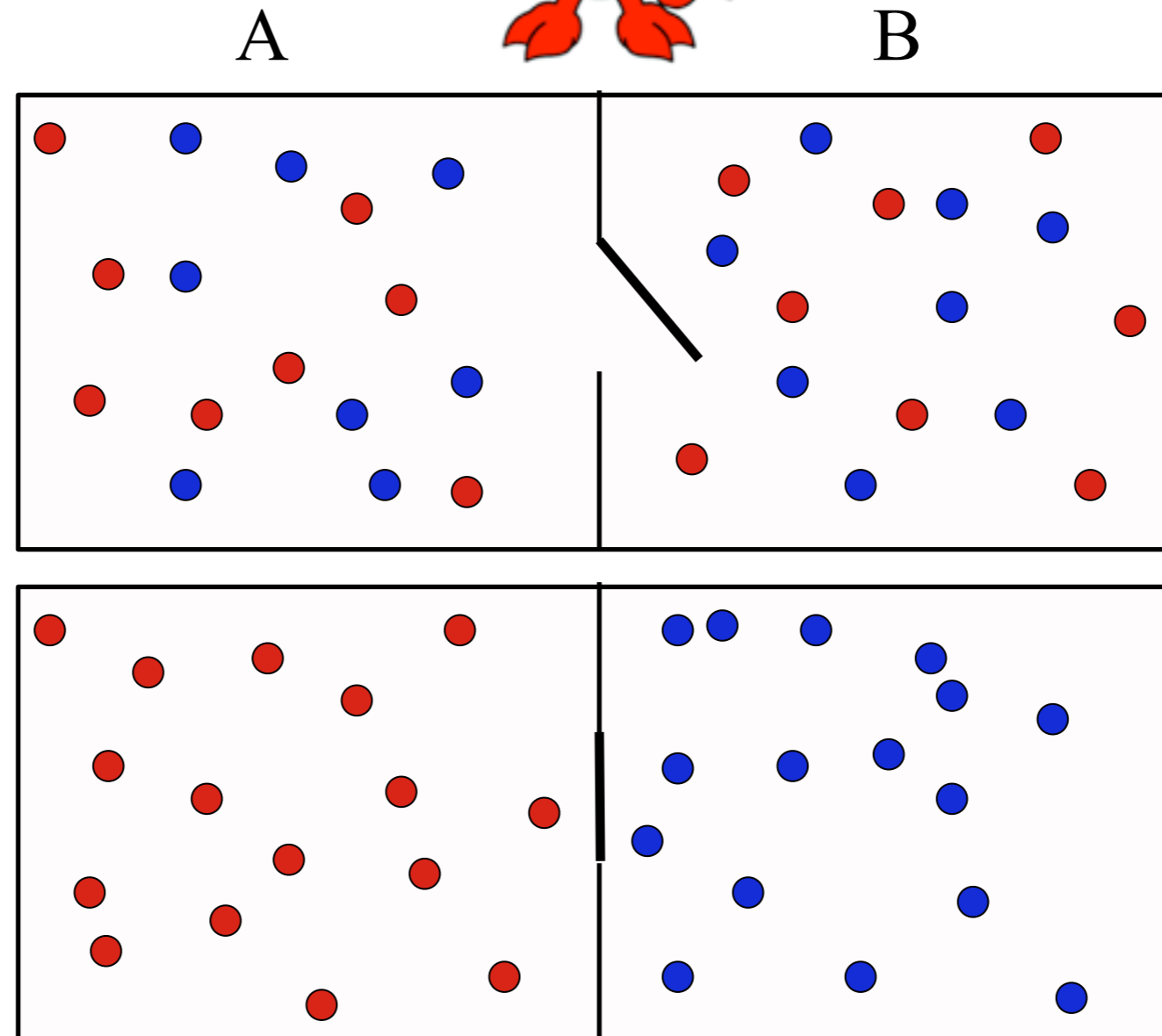
- **fast molecules**

# Landauer's Principle and The Maxwell's Demon

The first explanation came in 1929 by Leó Szilárd, and later by Léon Brillouin



- **slow molecules**
- **fast molecules**



## The Landauer's principle (I)

Any logically irreversible transformation of classical information is necessarily accompanied by the dissipation of at least  $k_B T \cdot \ln 2$  of heat per lost bit (about  $3 \cdot 10^{-21}$  Joules at room temperature)

Typical examples of logically irreversible transformations are Boolean functions such as AND, NAND, OR and NOR  
They map several input states onto the same output state

The **erasure of information**, the **RESET TO ONE operation**, is logically irreversible and leads to an entropy production of  $k_B \cdot \ln 2$  per erased bit

## Landauer's principle II

Landauer's principle is a central result which exorcises the Maxwell's demon

It has been criticised and never tested in a real experiment

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### Questions

- Can the Landauer's limit be reached in any experiment ?
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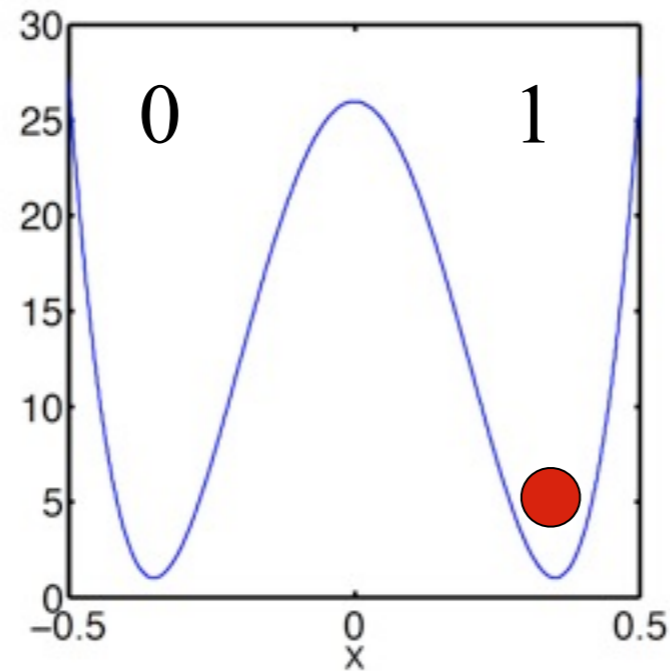
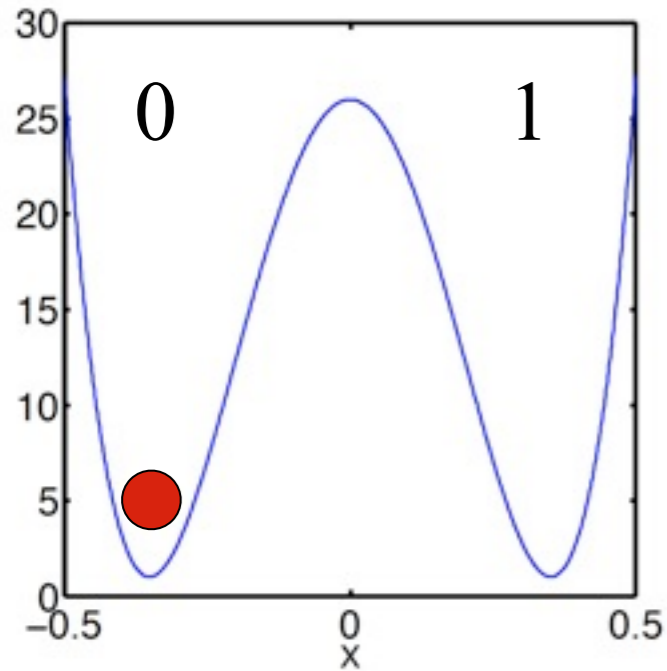
- Can the Landauer's limit be reached in any experiment ?
- Does any experimentally feasible procedure allow us to reach the limit ?

Following Bennett we use in our experiment the RESET to ONE operation

Bennett, C. H. The thermodynamics of computation, a review. Int. J. Theor. Phys. 21, 905-940 (1982).



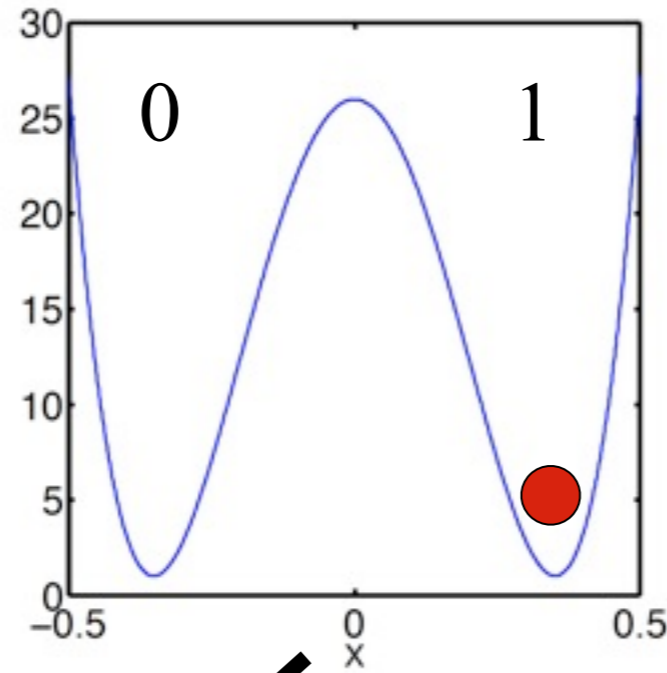
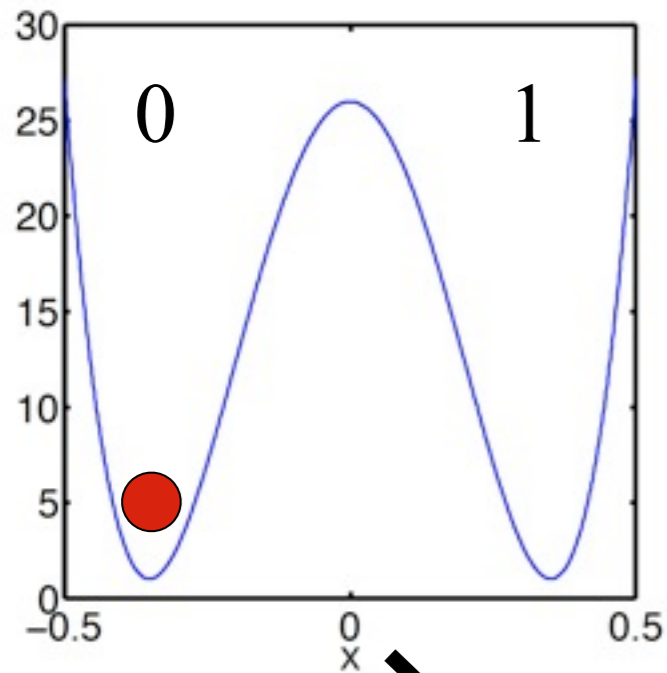
# The Bennett's erasure procedure



Initial state is 0 or 1 with  
equal probability 1/2

$$S_i = k_B \cdot \ln 2$$

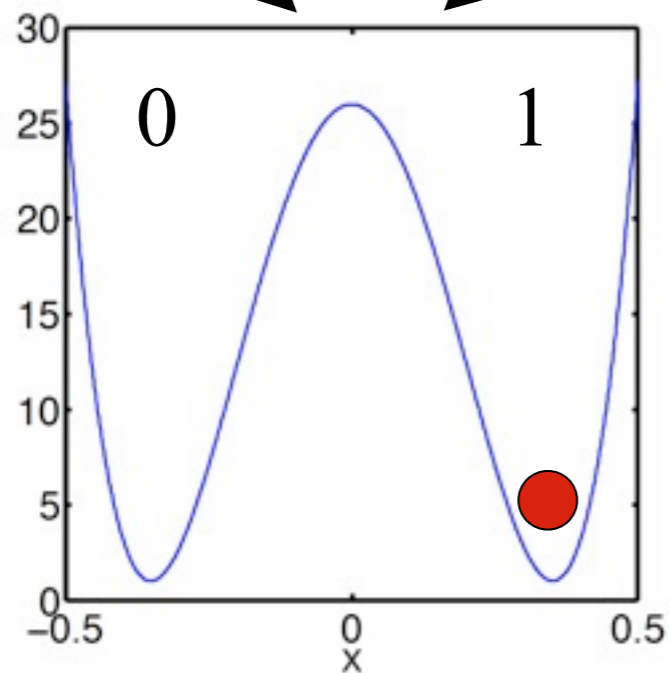
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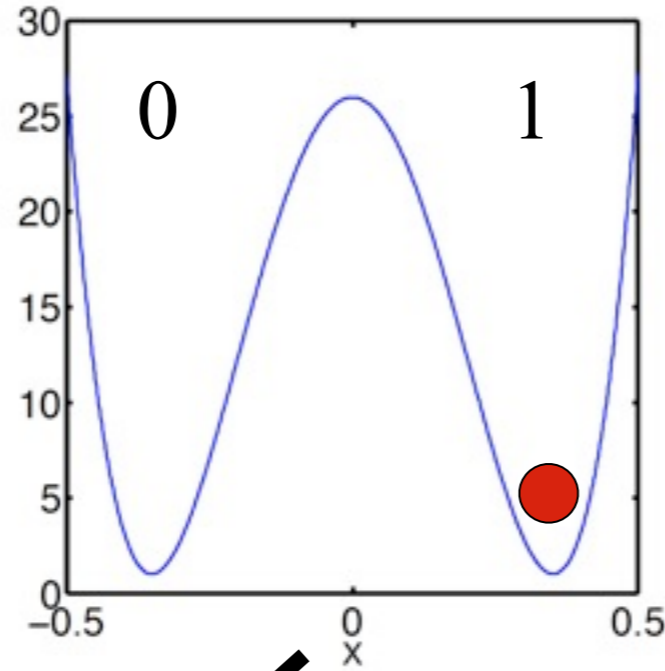
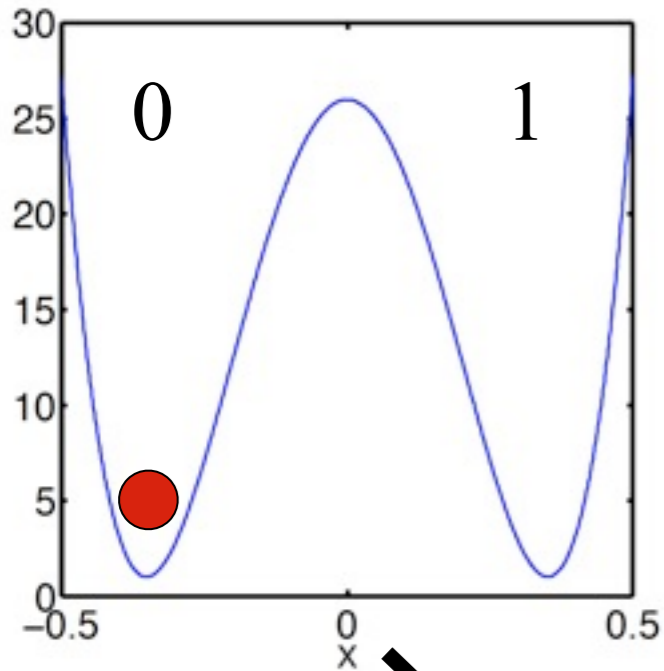
Procedure



Final state is 1 with probability 1

$$S_f = 0$$

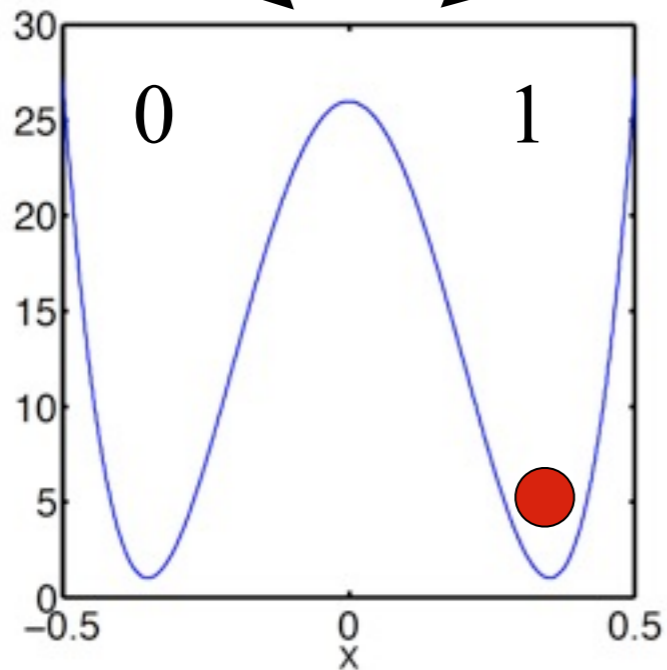
# The Bennett's erasure procedure



Initial state is 0 or 1 with equal probability  $1/2$

$$S_i = k_B \ln 2$$

Procedure



Final state is 1 with probability 1

$$S_f = 0$$

Thus  $\Delta S_{\min} = -k_B \ln 2$

Quasi Static :  $-T\Delta S=Q$

Energy variation :  $\Delta U=0$

First principle :  $\Delta U=-Q+W$



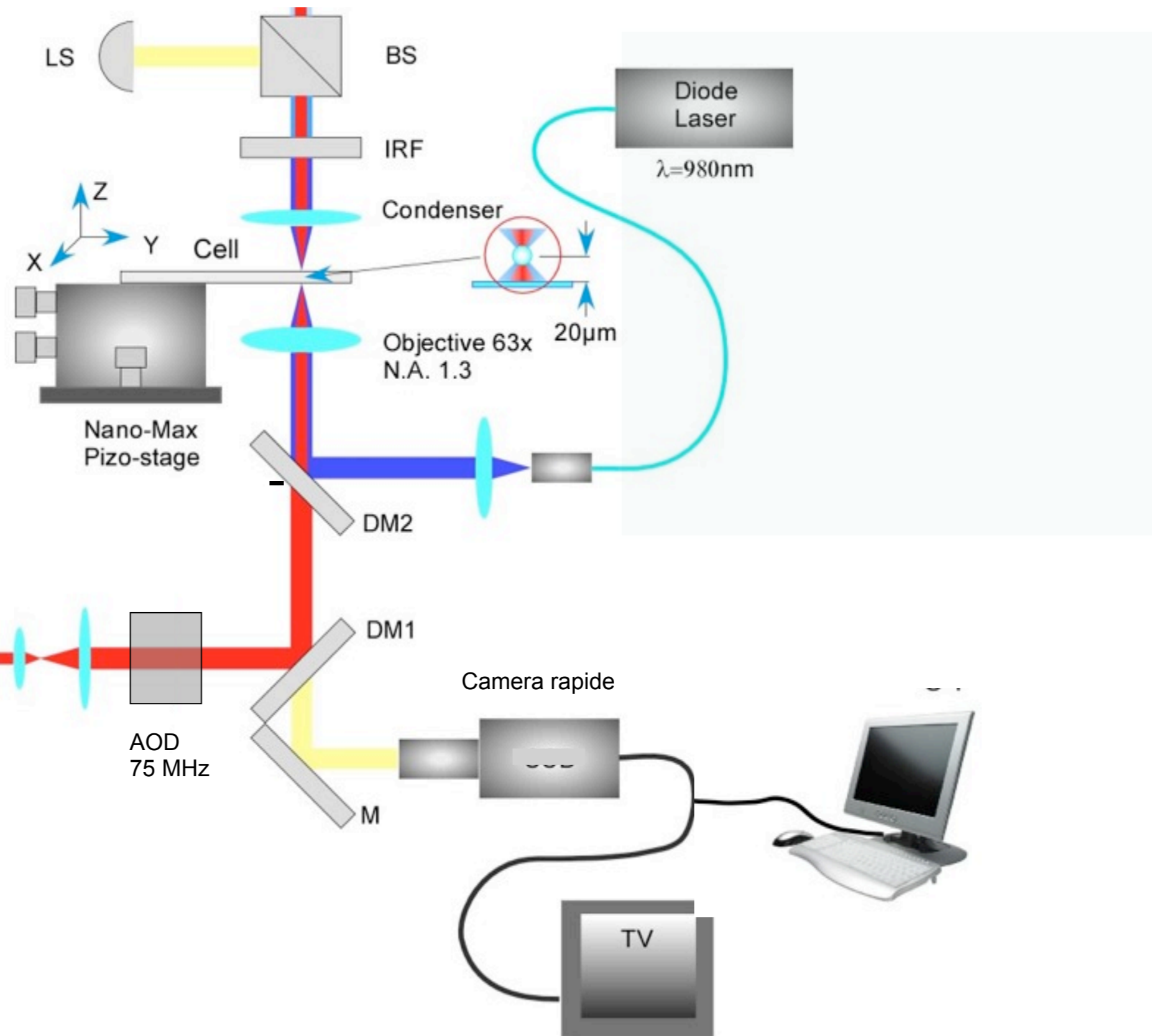
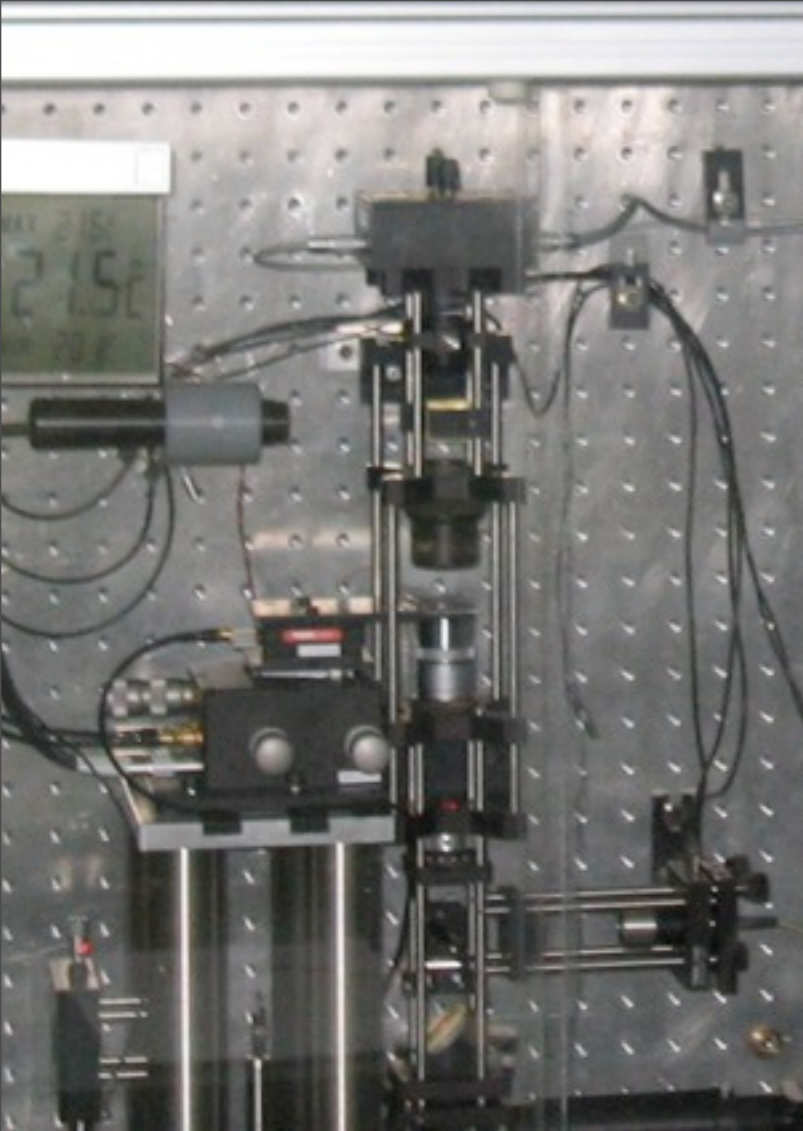
In average :  $\langle W \rangle = \langle Q \rangle = -T \Delta S \geq k_B T \ln(2)$

Numerical result :

*Memory Erasure in Small Systems,*

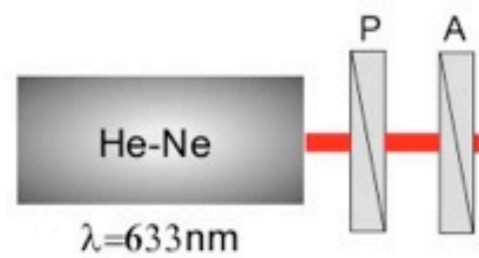
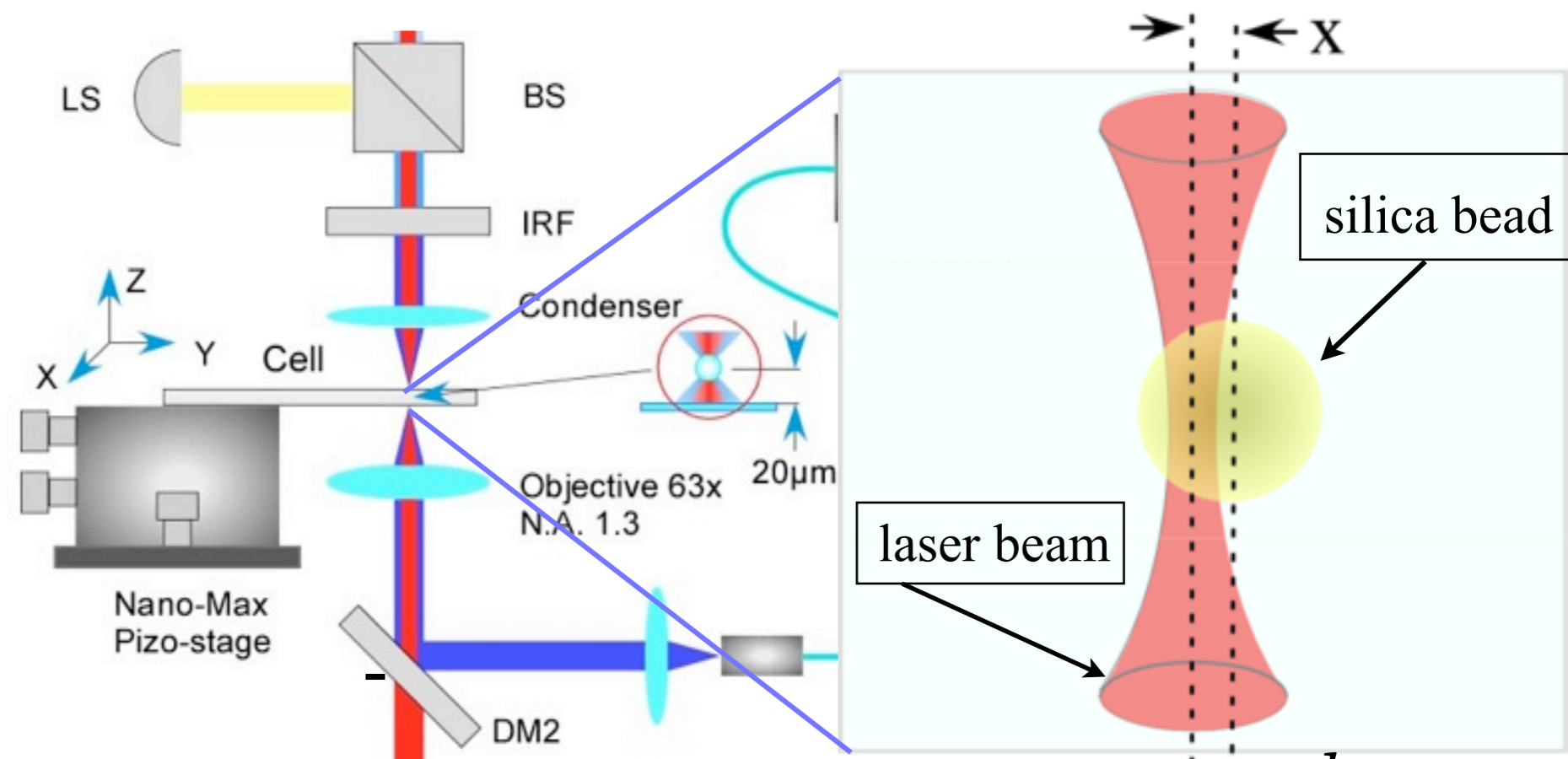
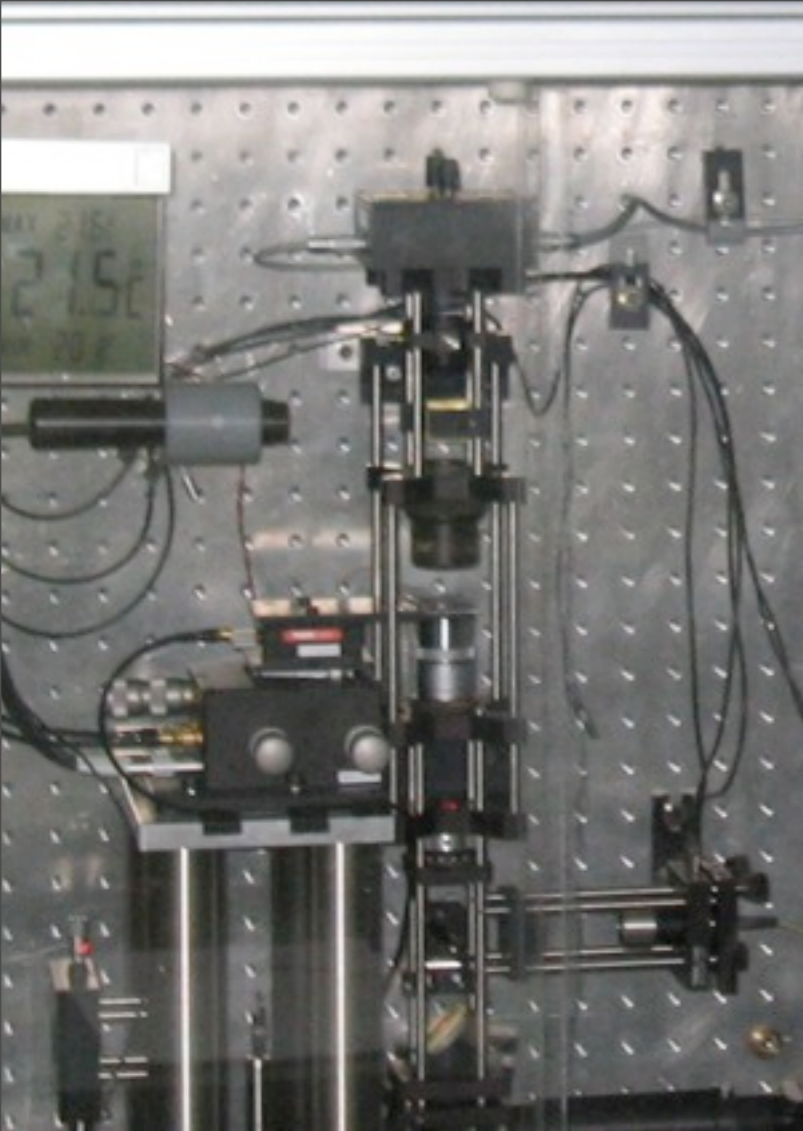
R. Dillenschneider and E. Lutz, Phys. Rev. Lett. 102, 210601 (2009)

# Experimental set-up Optical trap



- LS white light source
- DM dichroic mirror
- M mirror
- IRF infrared filter
- IF interference filter
- P polarizer
- A analyzer
- QD quadrant photo diode

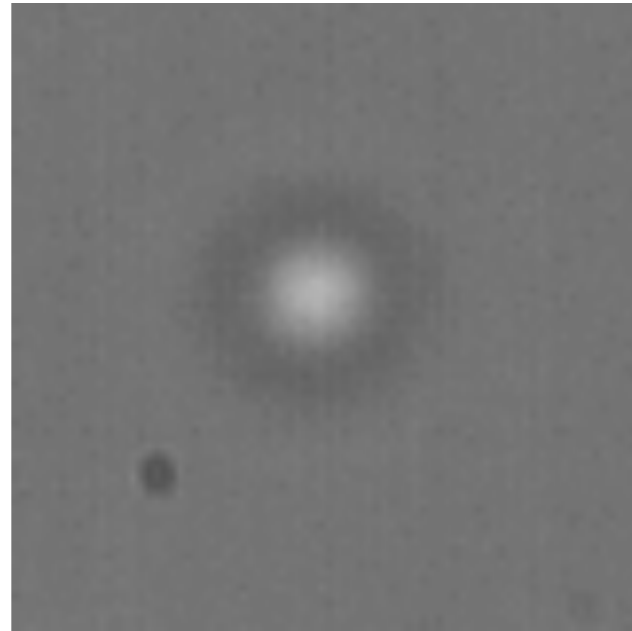
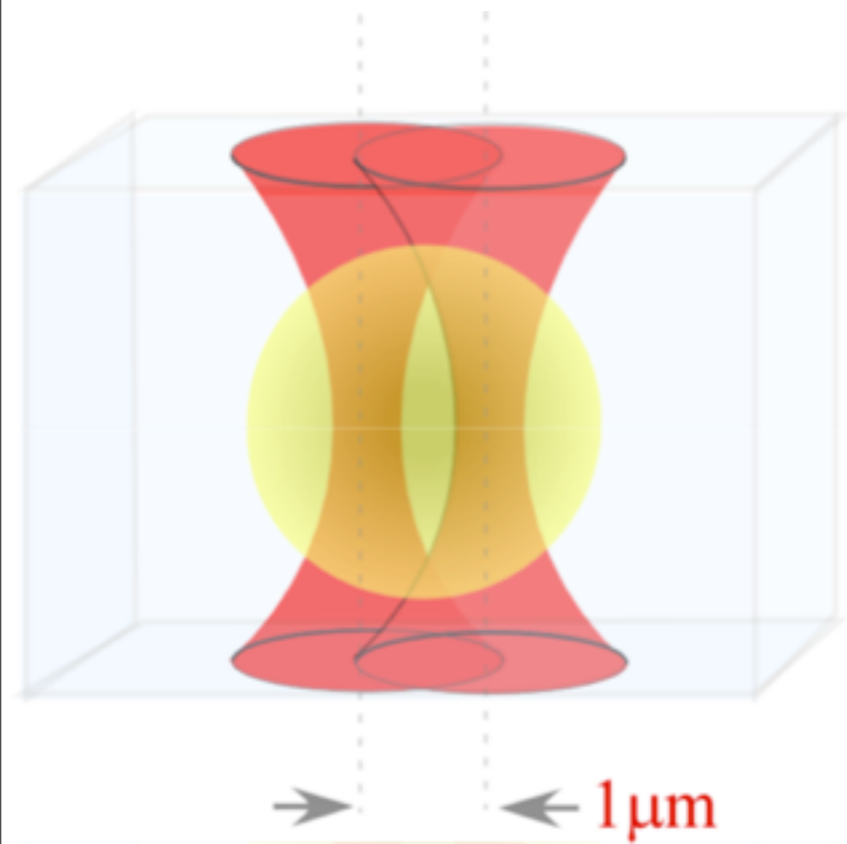
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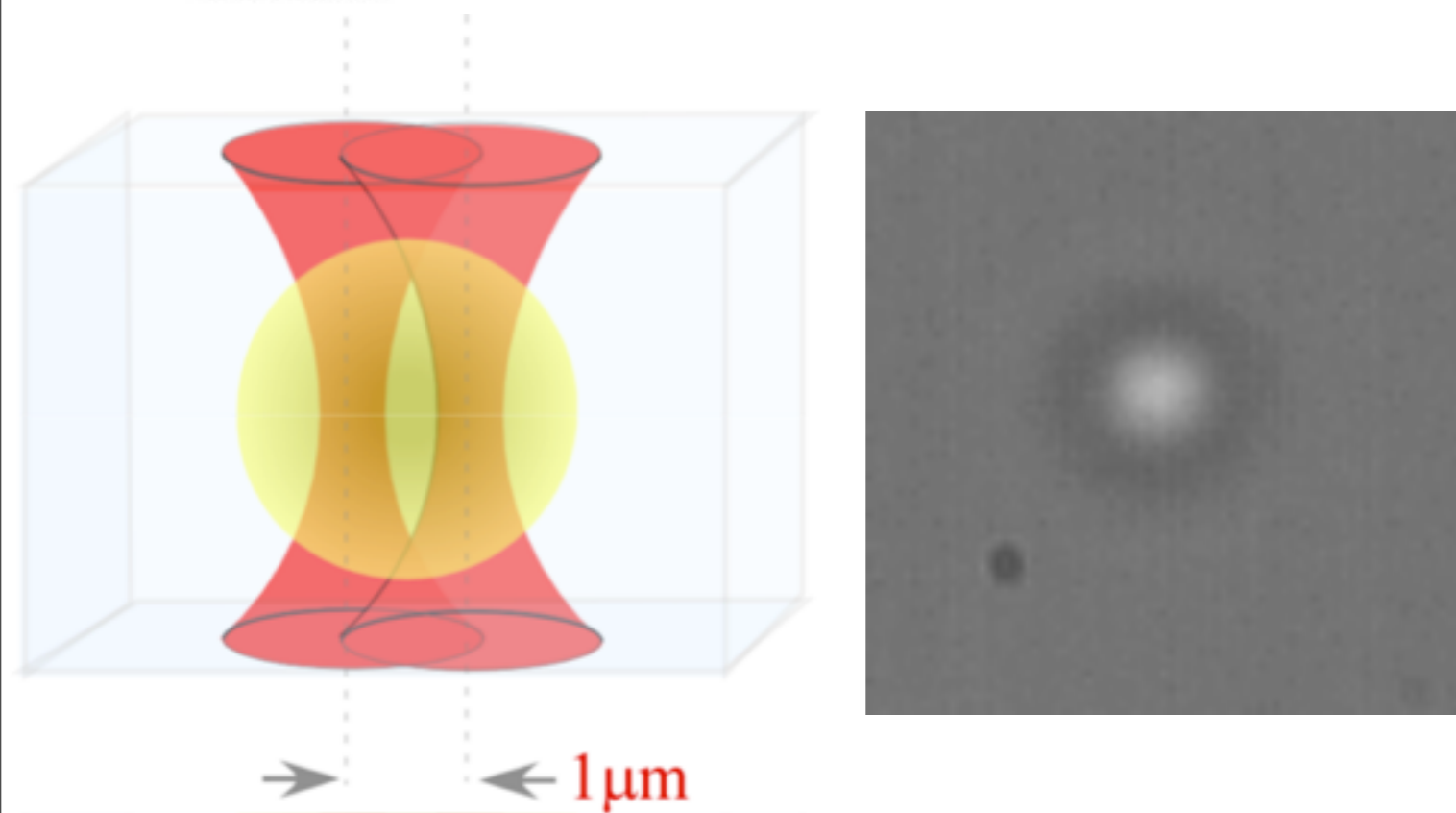


AOD  
75 MHz

- LS white light source
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# Brownian particle trapped by two laser beams

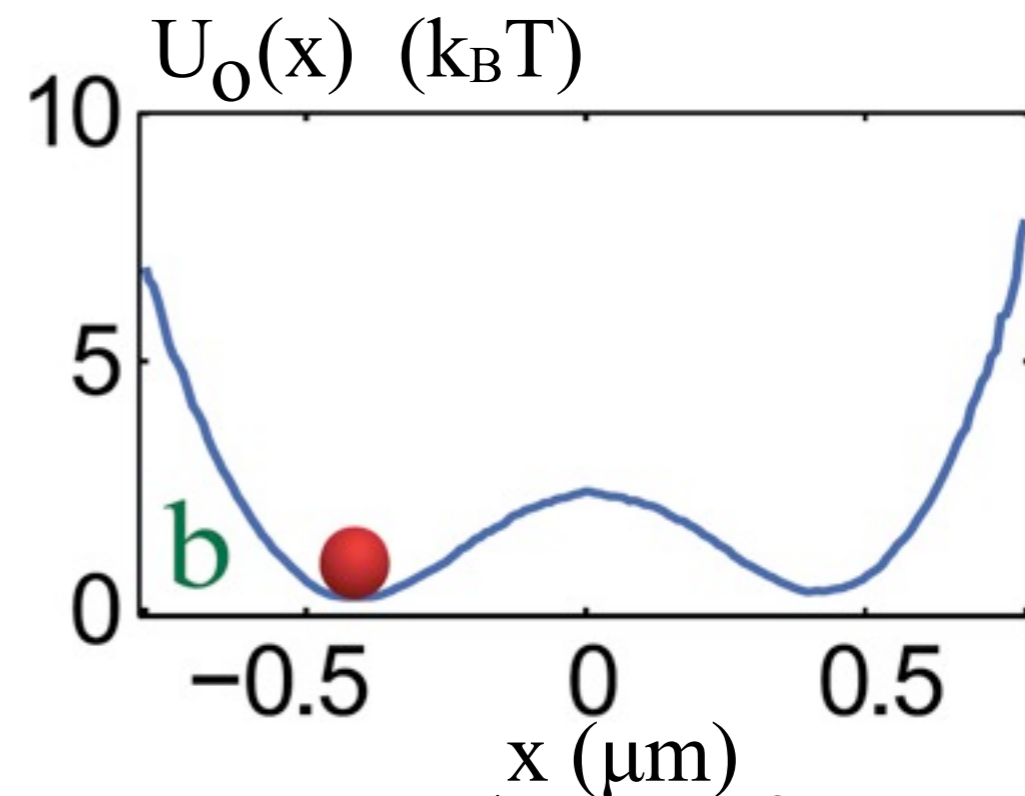
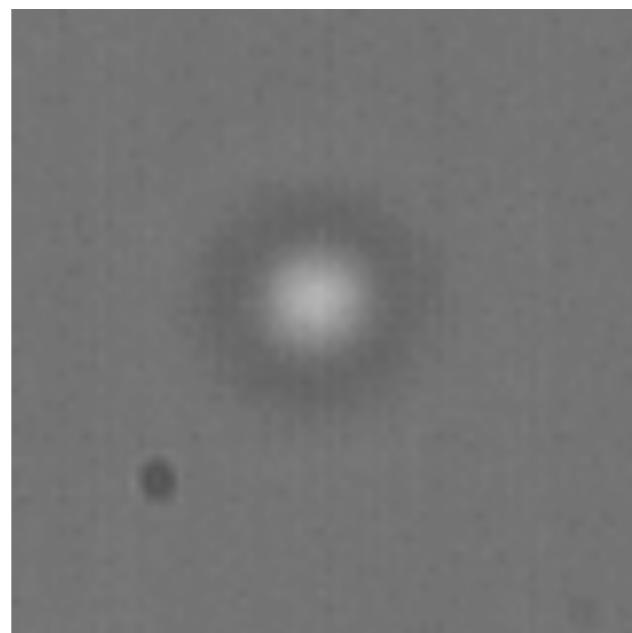
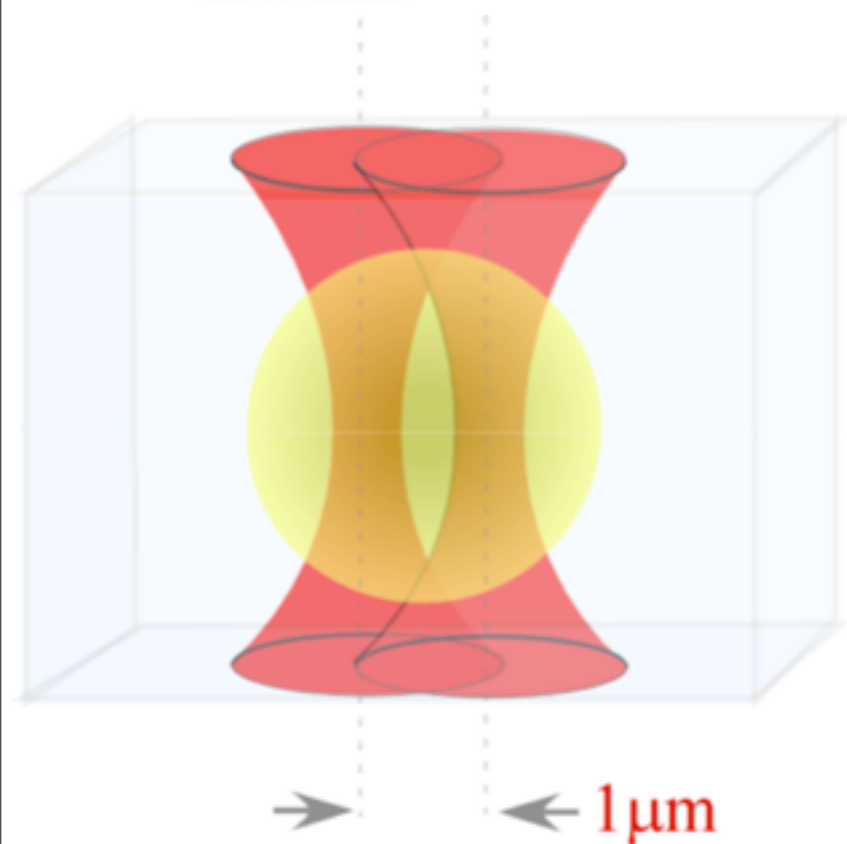




Trapping potential is constructed using the Boltzmann factor

$$P(x) \propto \exp\left(\frac{U(x)}{k_B T}\right)$$

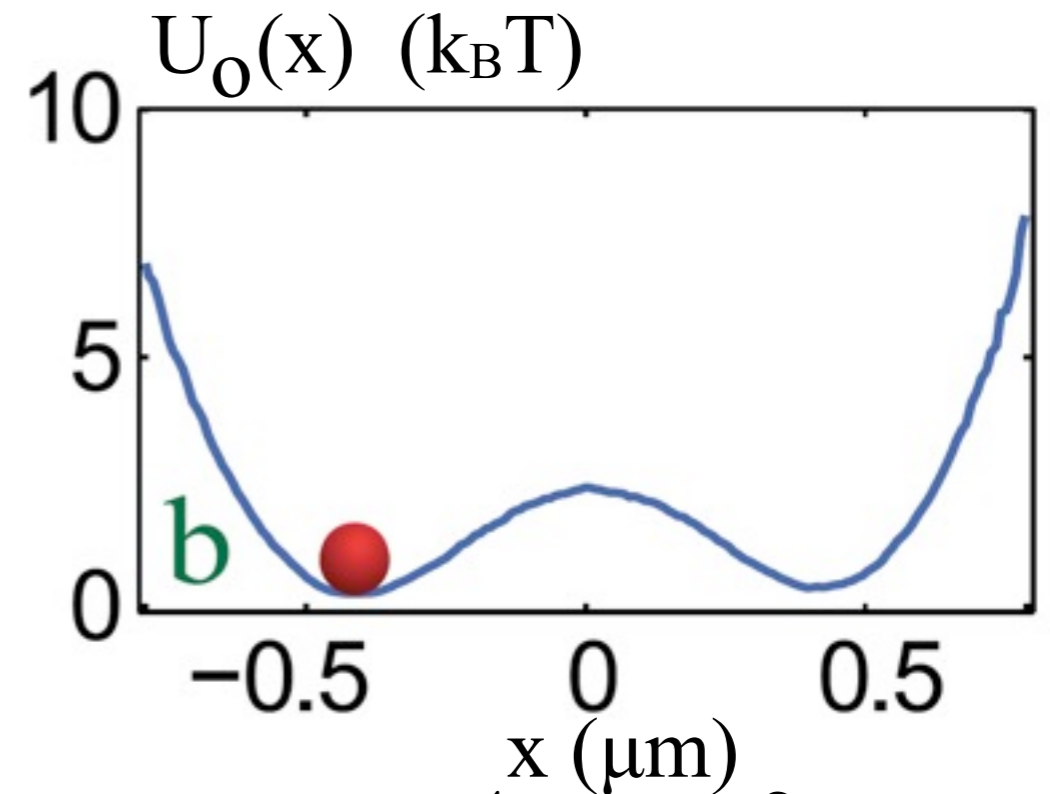
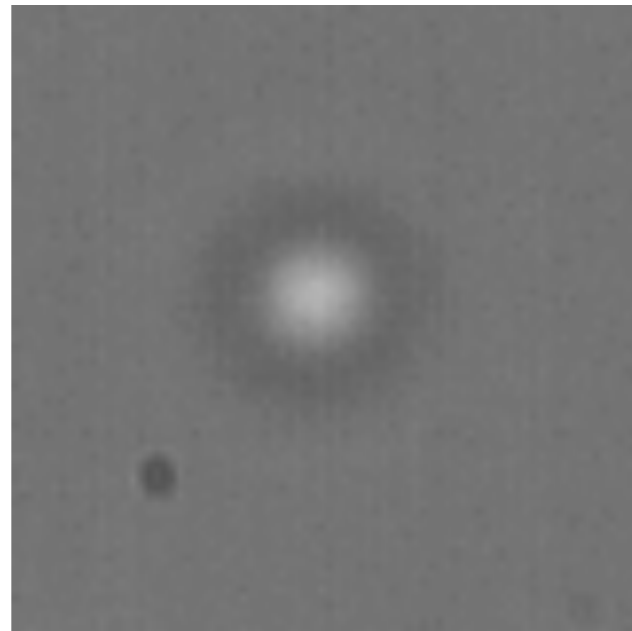
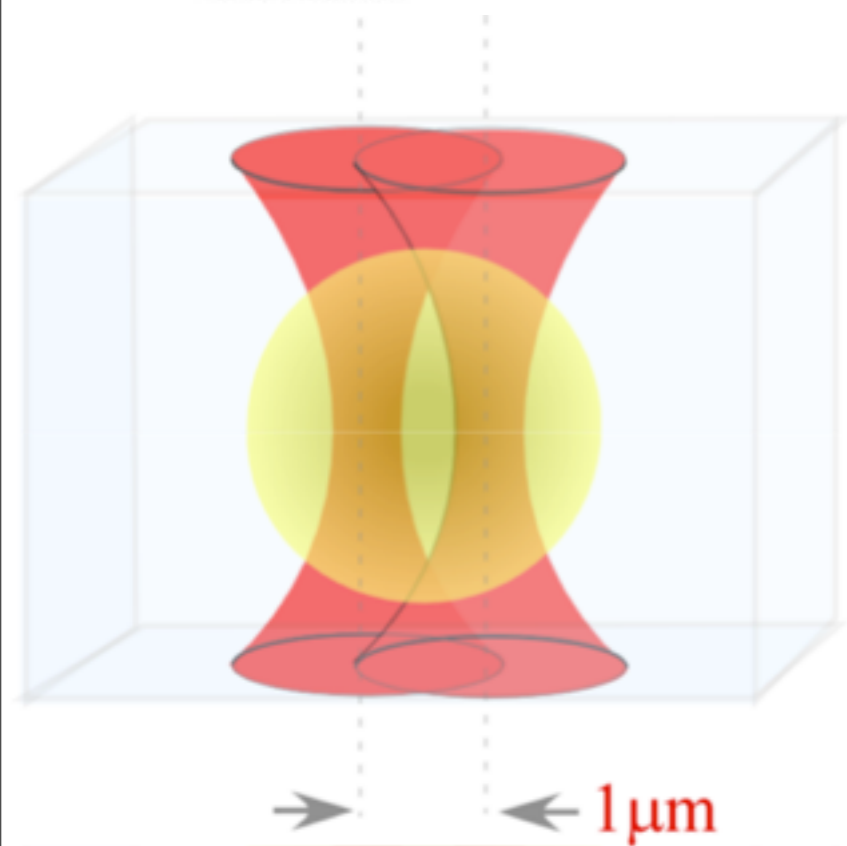




$$U_o(x) = a x^4 - b x^2 + d x$$

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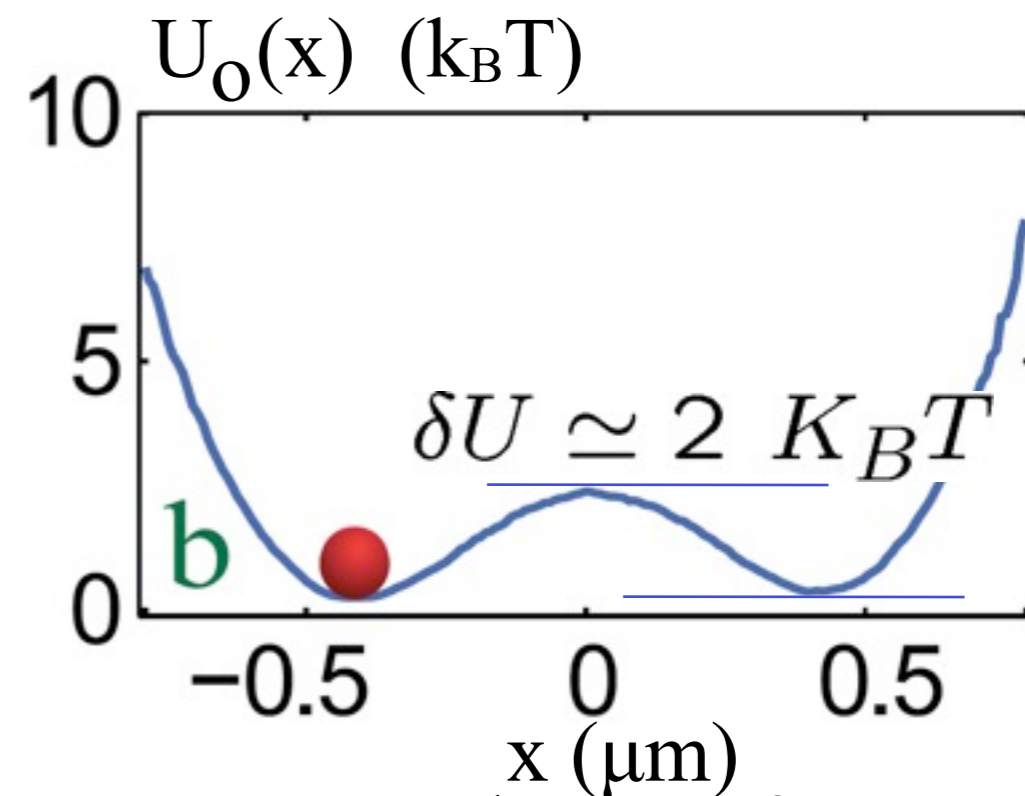
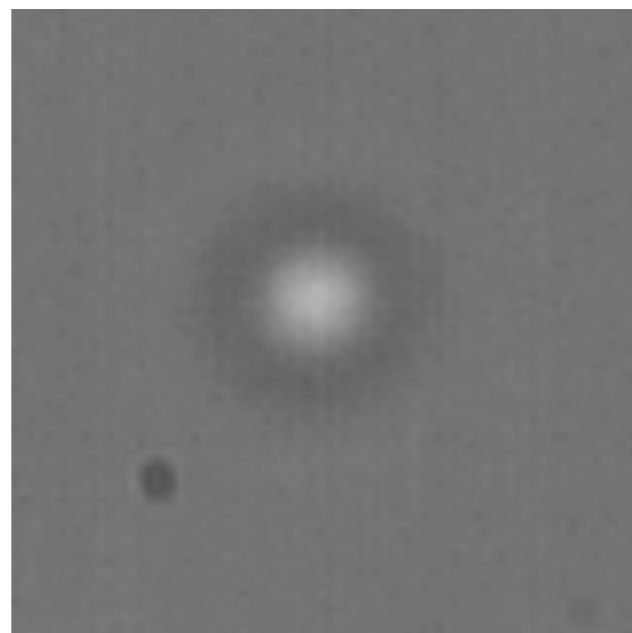
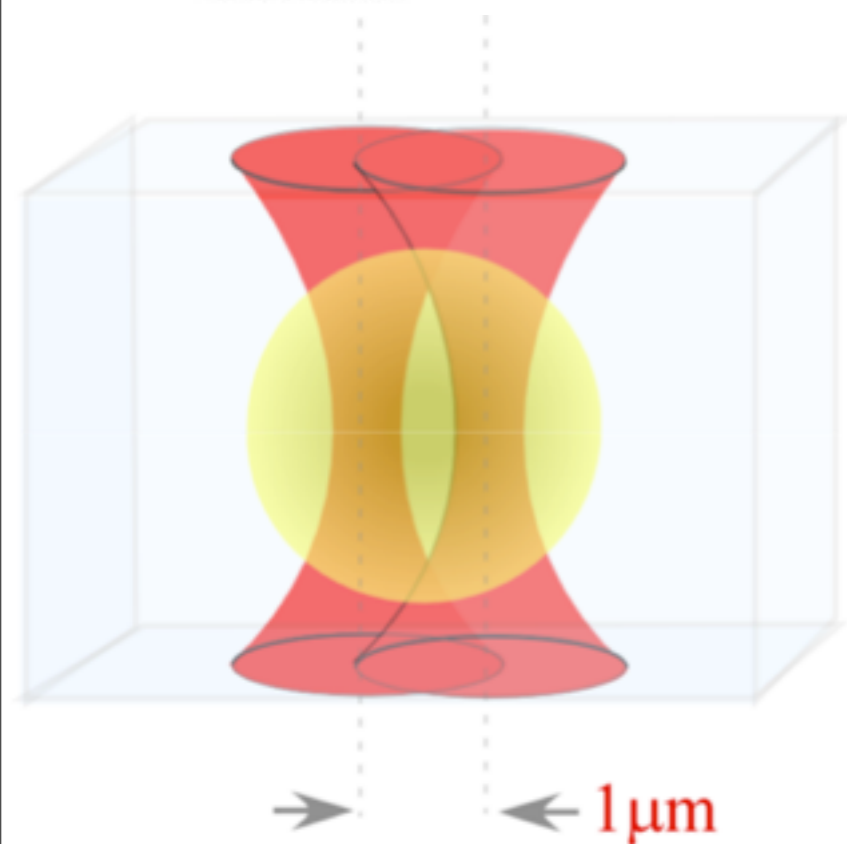
The Kramers time

$$\tau_K = \tau_o \exp\left[\frac{\delta U}{k_B T}\right]$$

with  $\tau_o = 1 \text{ s}$

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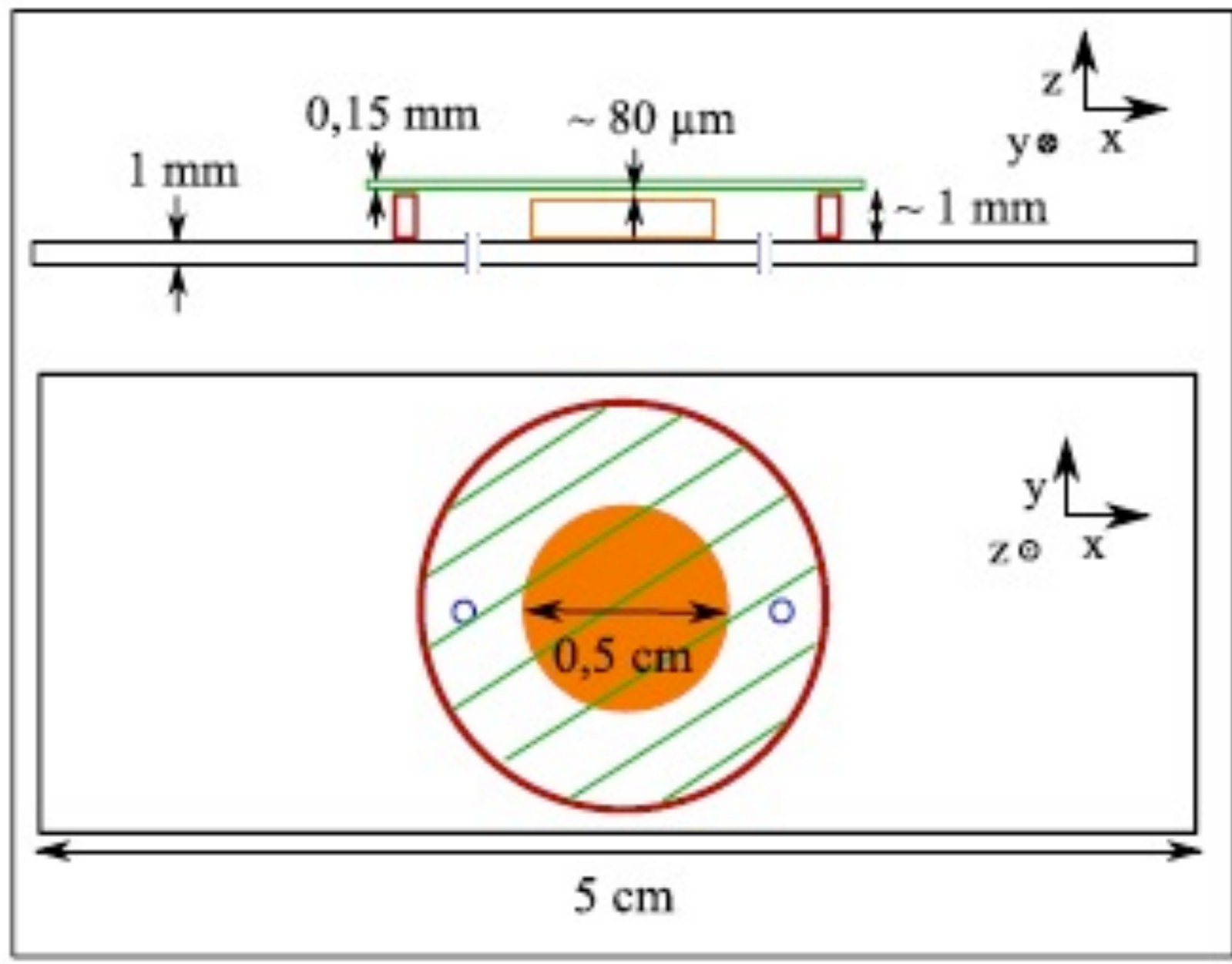
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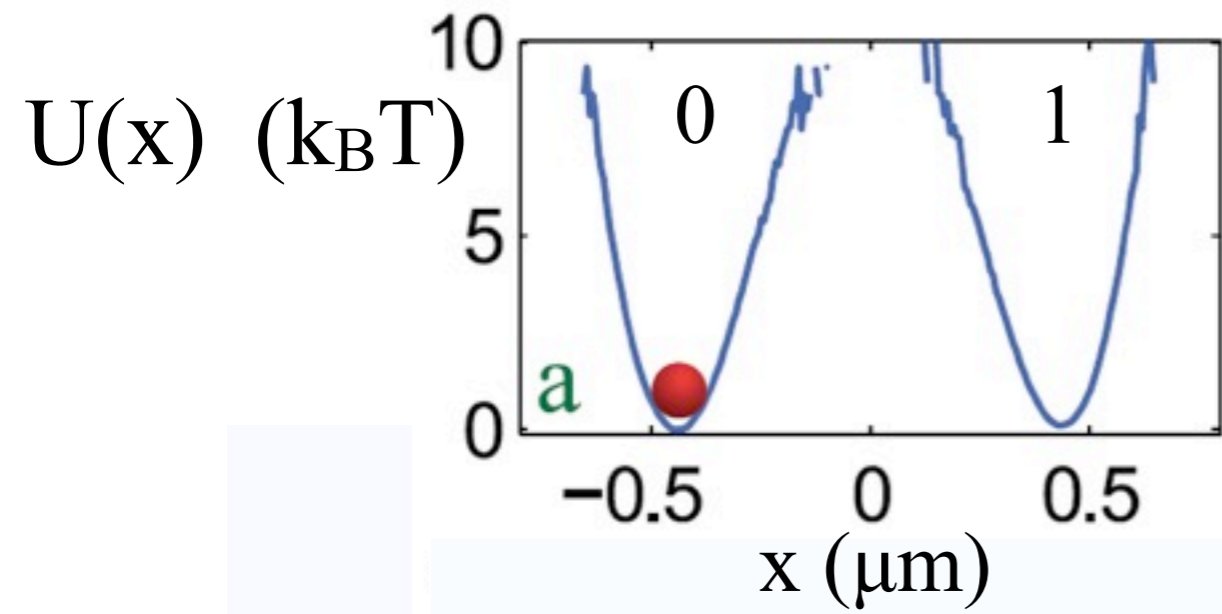
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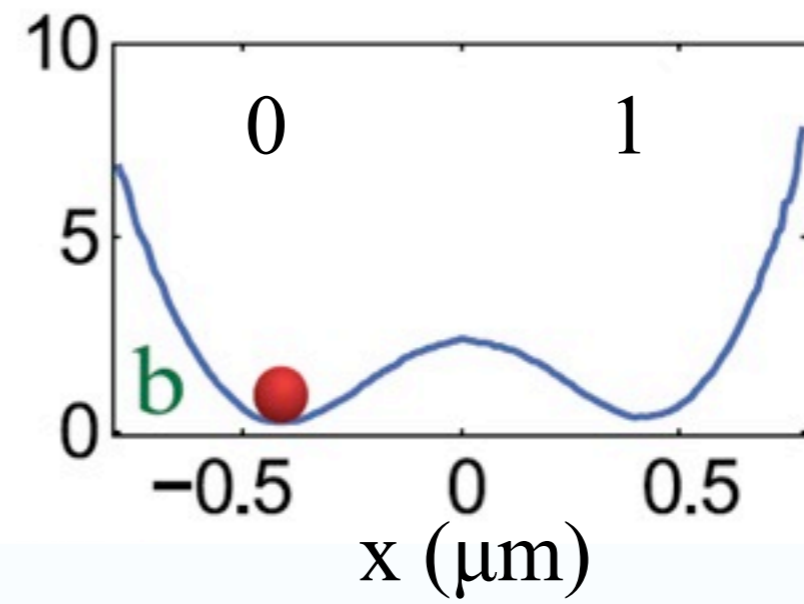
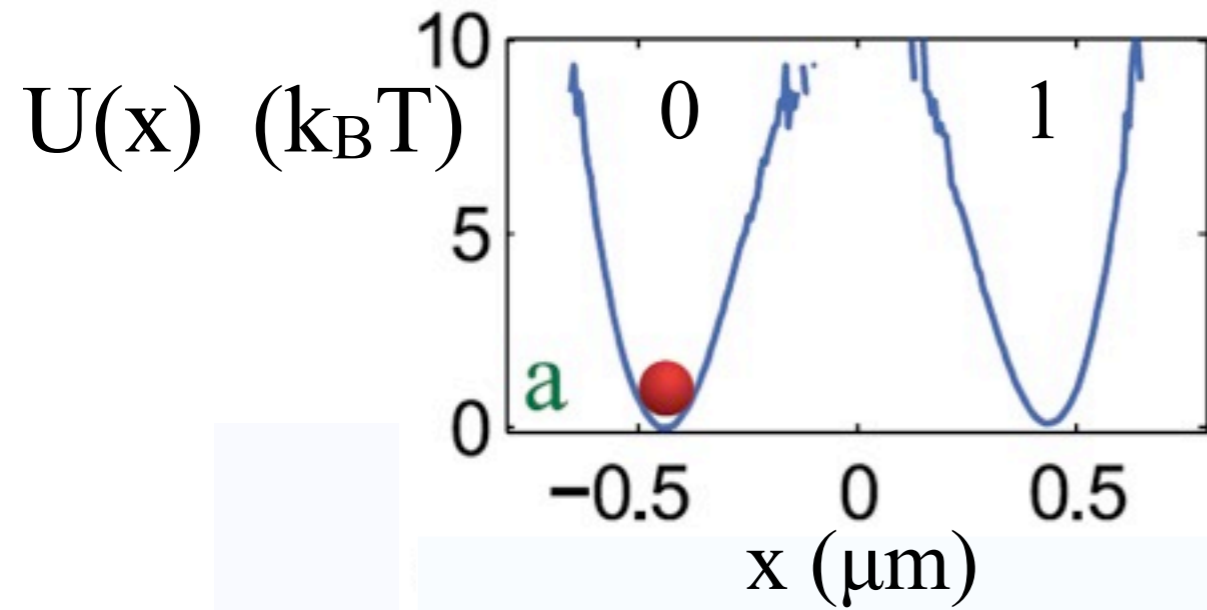
# The cell for the bead



## Initial state



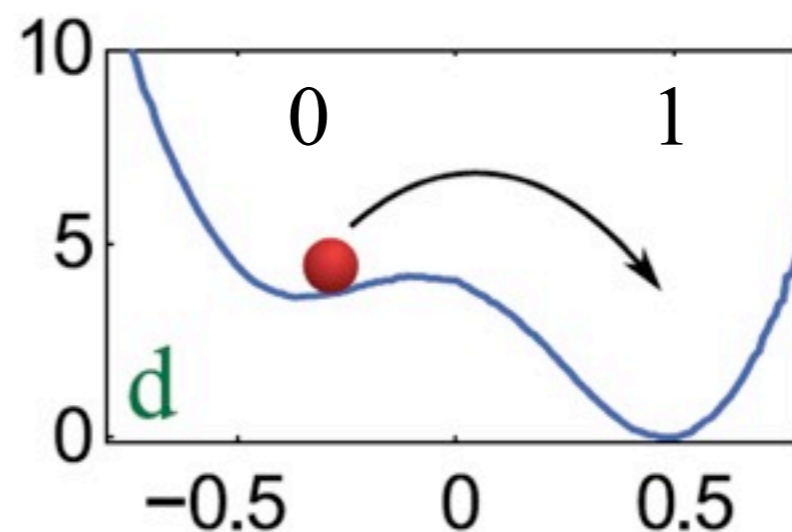
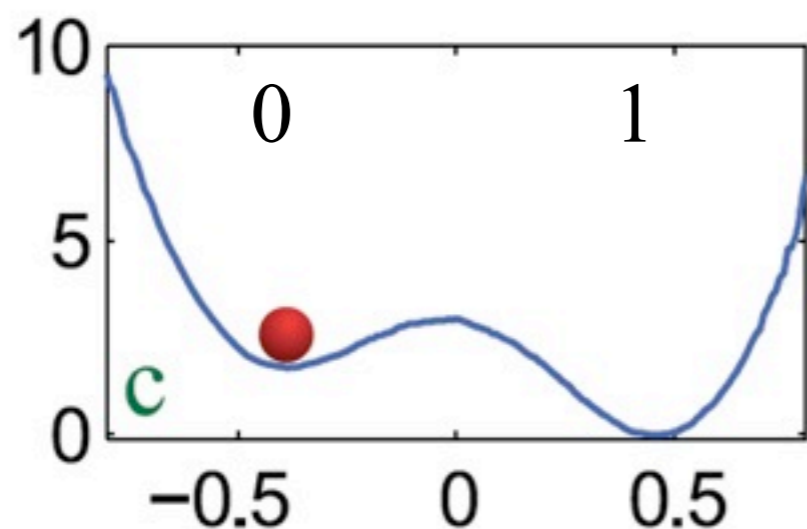
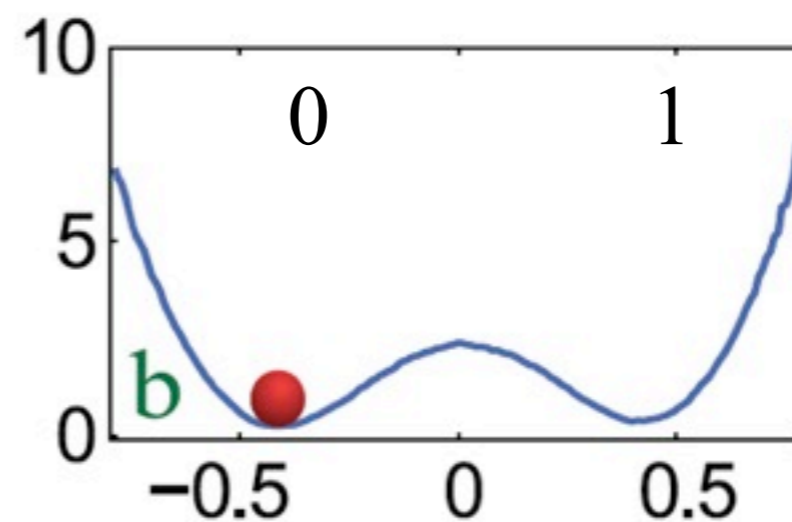
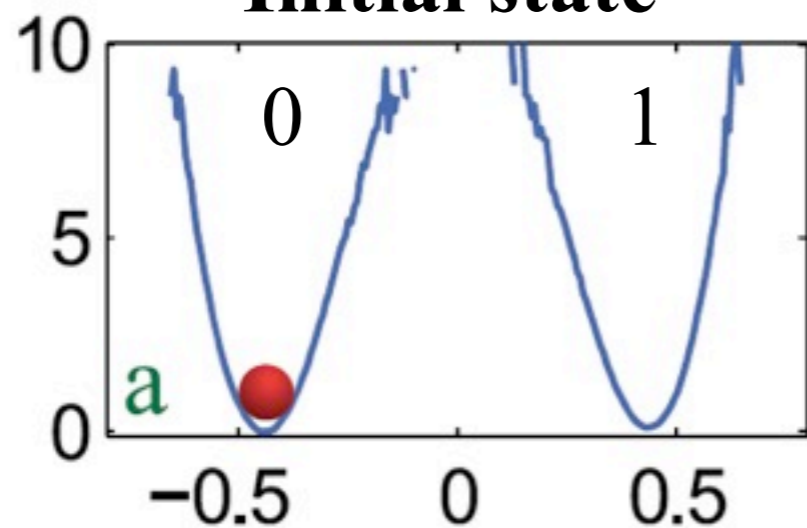
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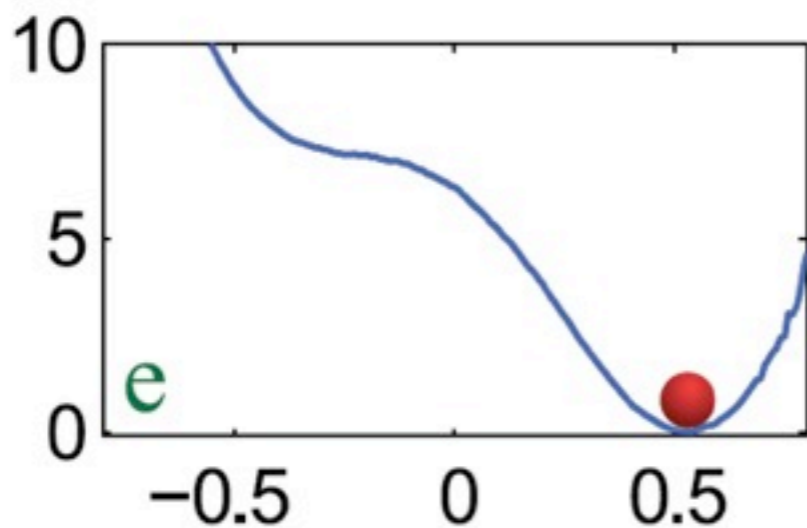
reduction  
of the barrier

## Initial state

$U(x)$  (k<sub>B</sub>T)



Progressive  
tilt of the  
potential

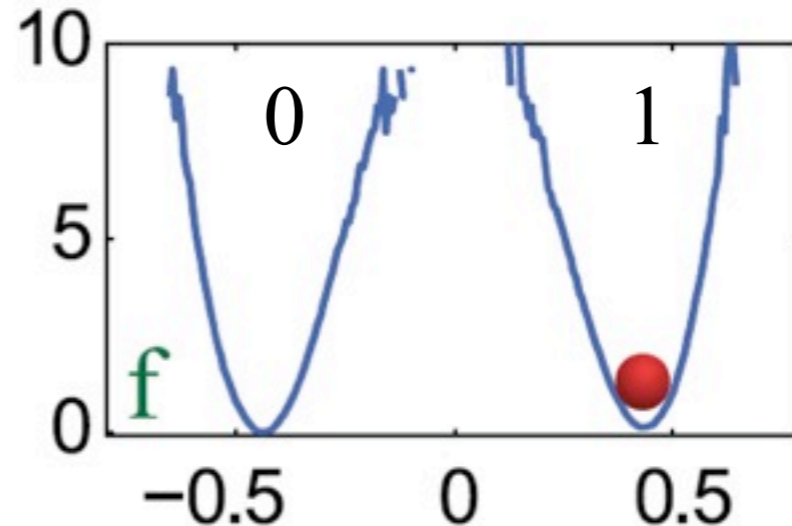
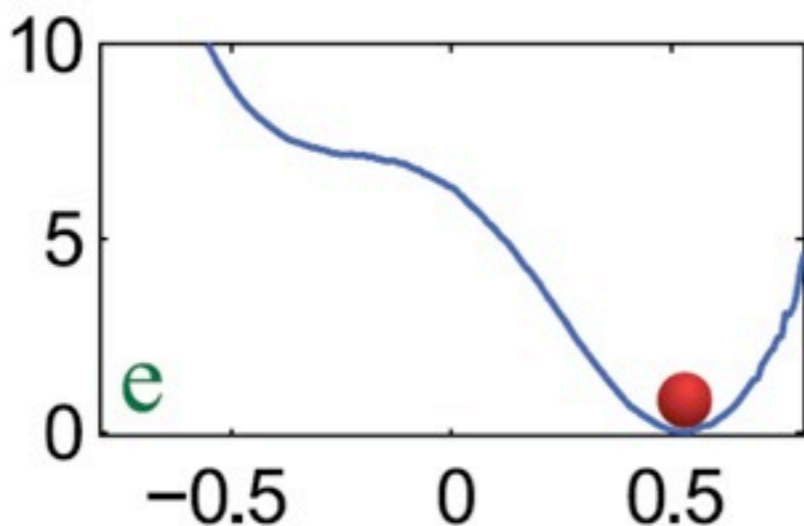
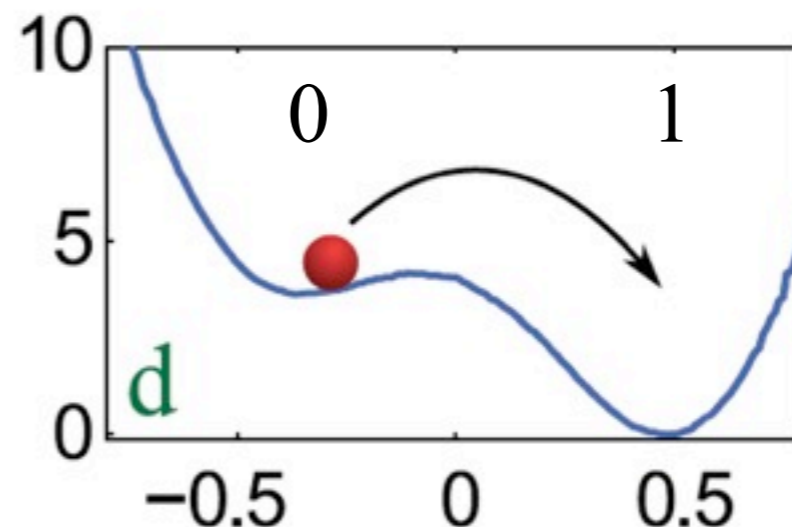
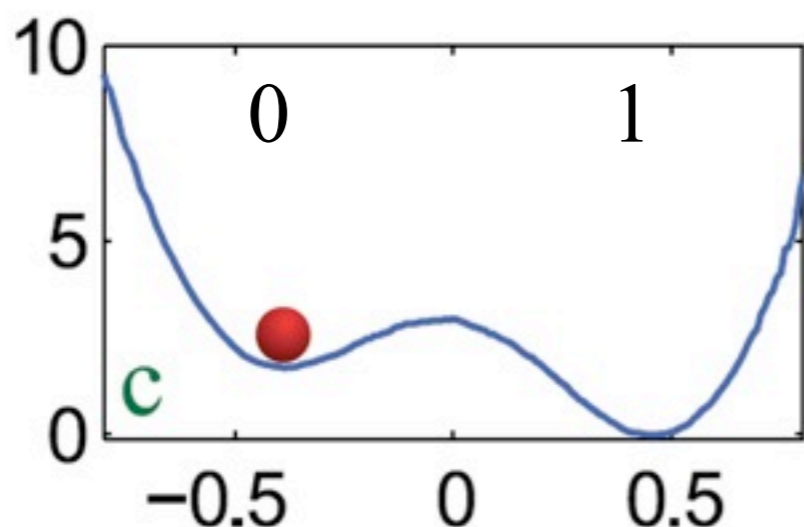
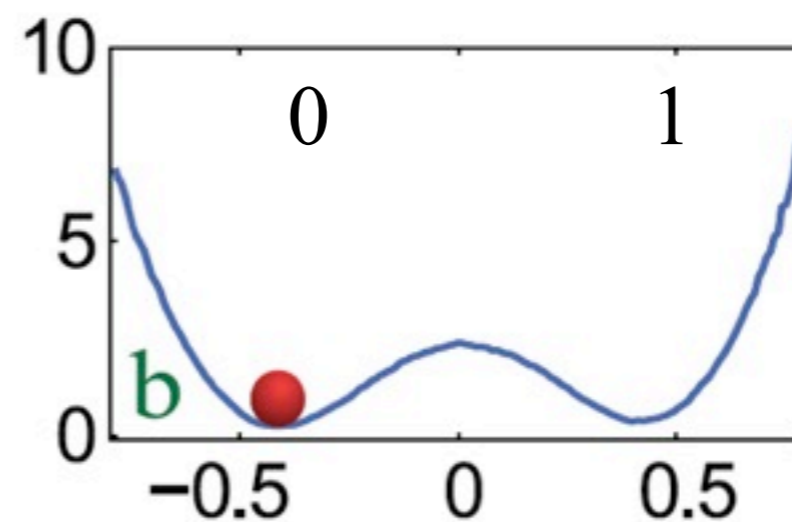
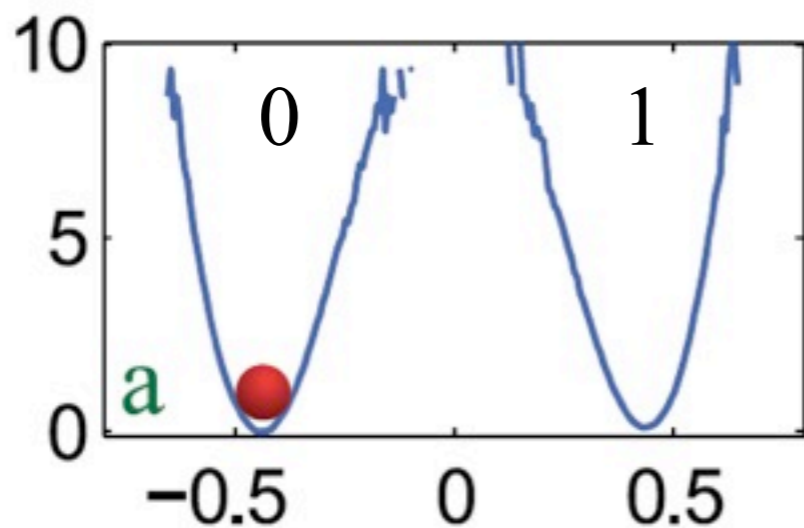


$x$  (μm)

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## Initial state

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$x$  (μm)

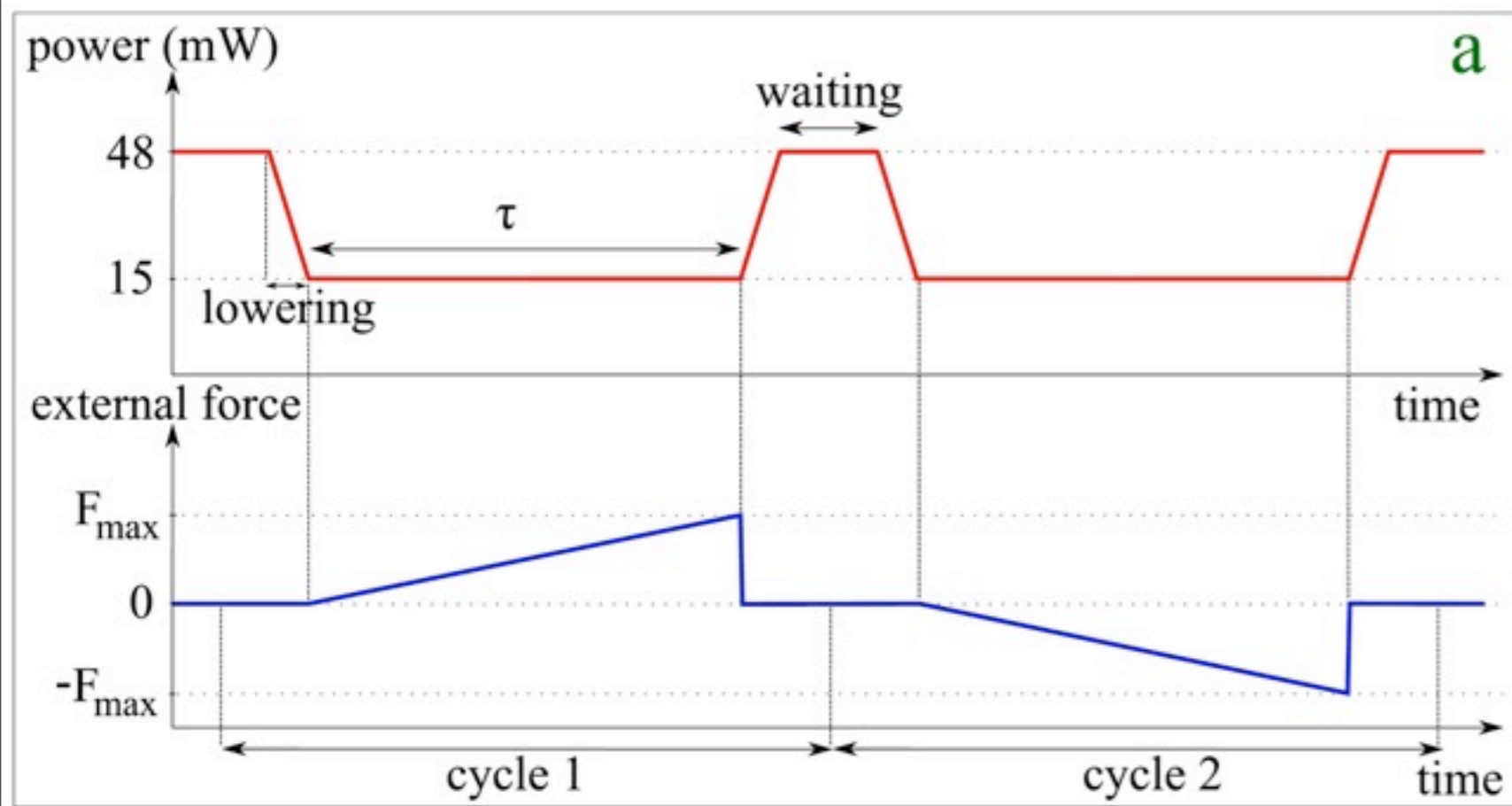
$x$  (μm)

Increasing of  
the barrier

**Final state**



# Potential external control as a function of time



The laser intensity controls the barrier height

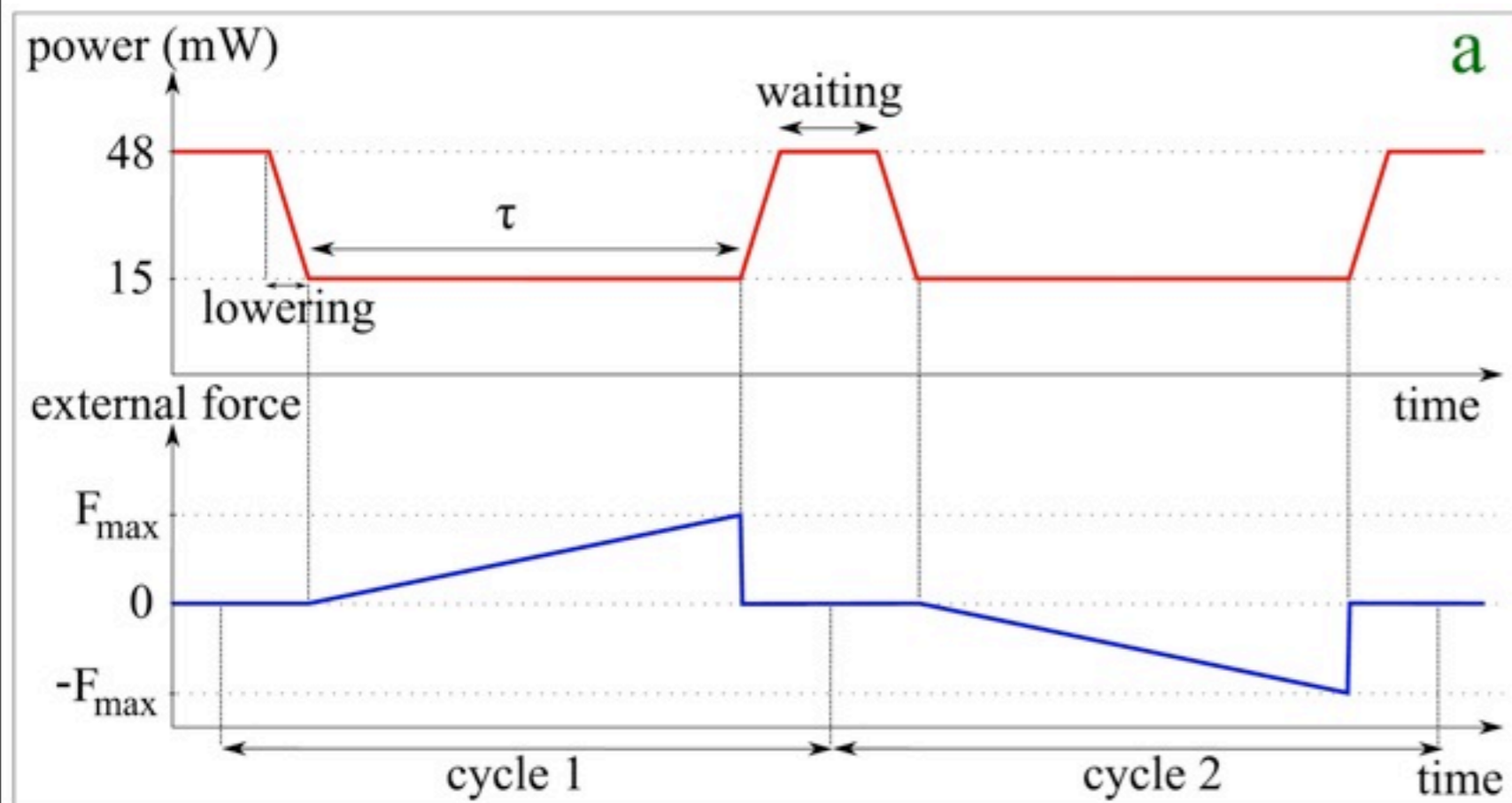
The potential tilt is produced by a linearly increasing external force  $F$ , applied on the time  $\tau$ .

$$\tau_{\text{cycle}} = \tau + 2 \text{ s}$$

The force  $F$  is created by displacing the cell with respect to the laser, thus

$$F = -\nu v \quad \text{with} \quad \nu = 6\pi R\mu$$

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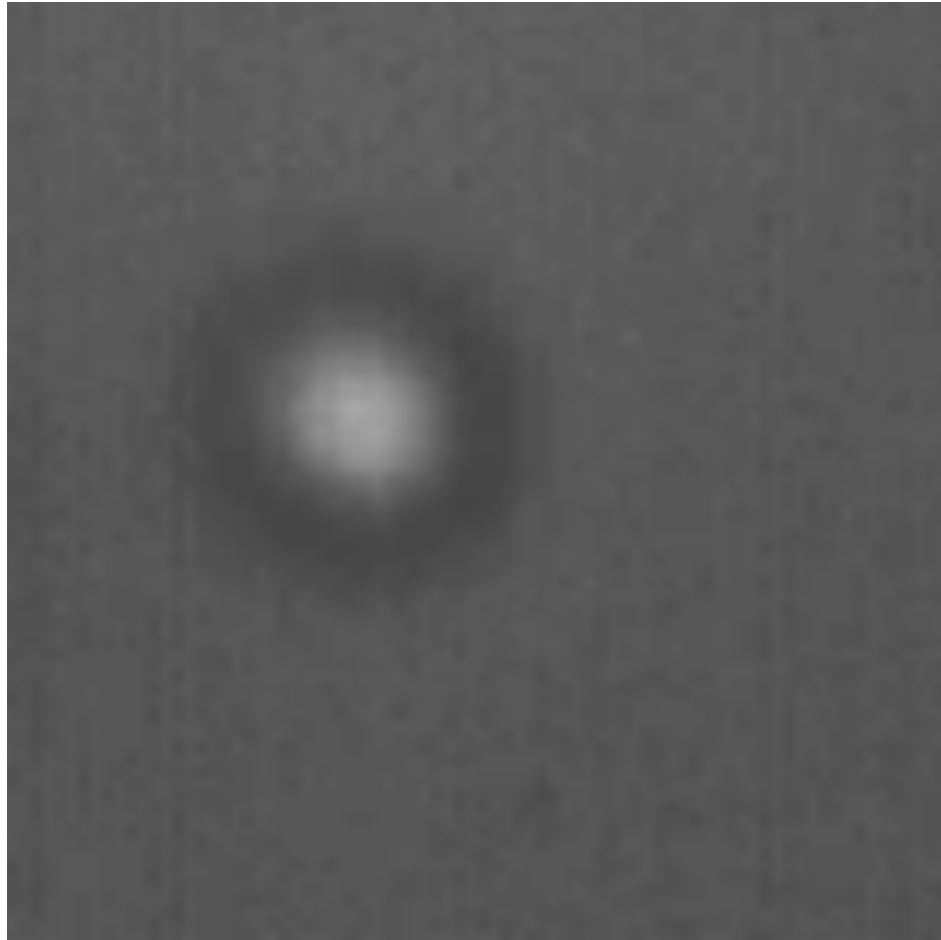
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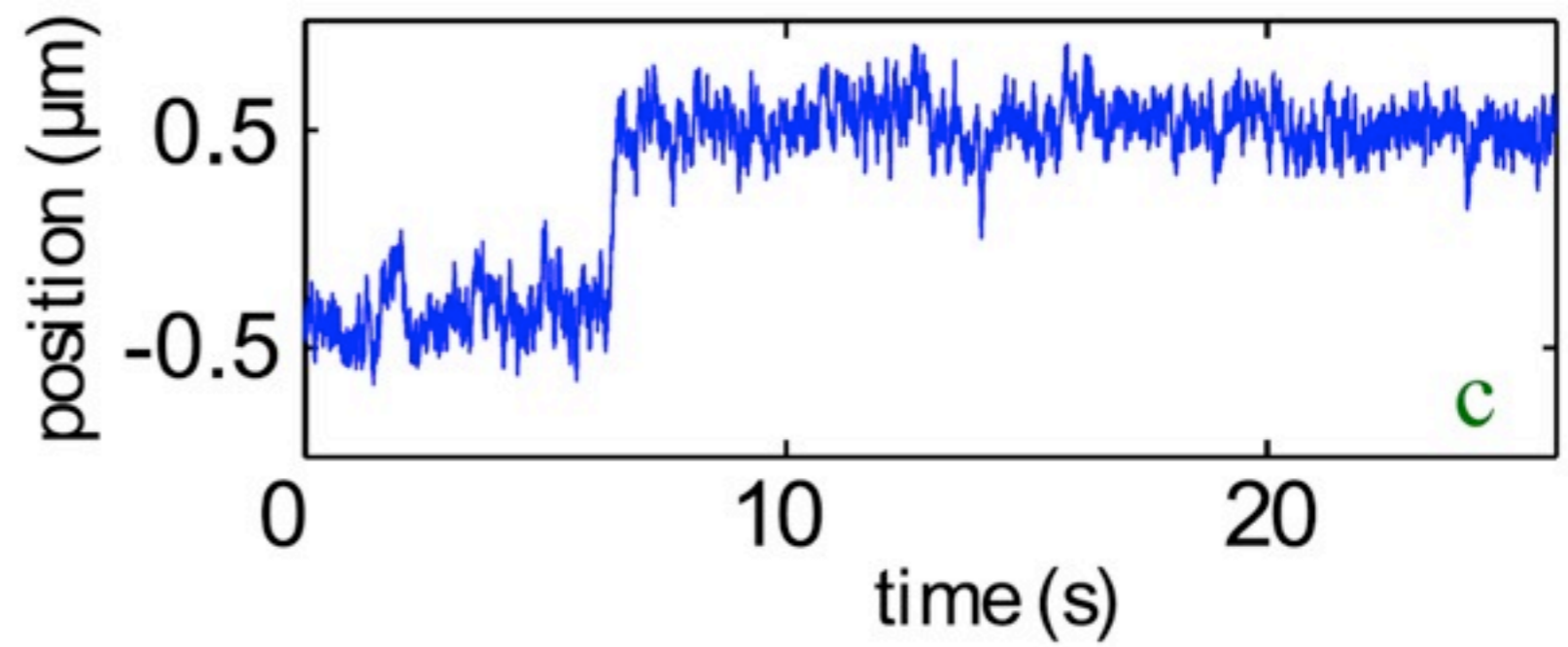
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Two control parameters:  $\tau$  the time of application of  $F$   
 $F_{\max}$  the maximum applied force

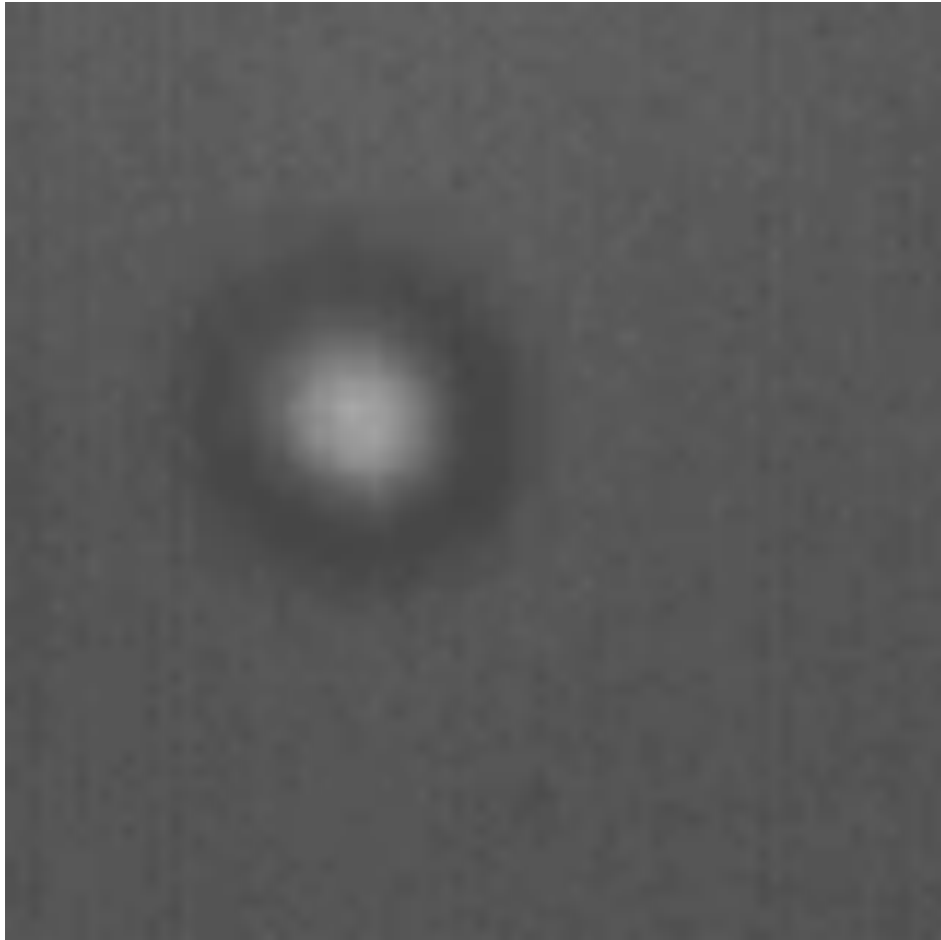
# Bead trajectories



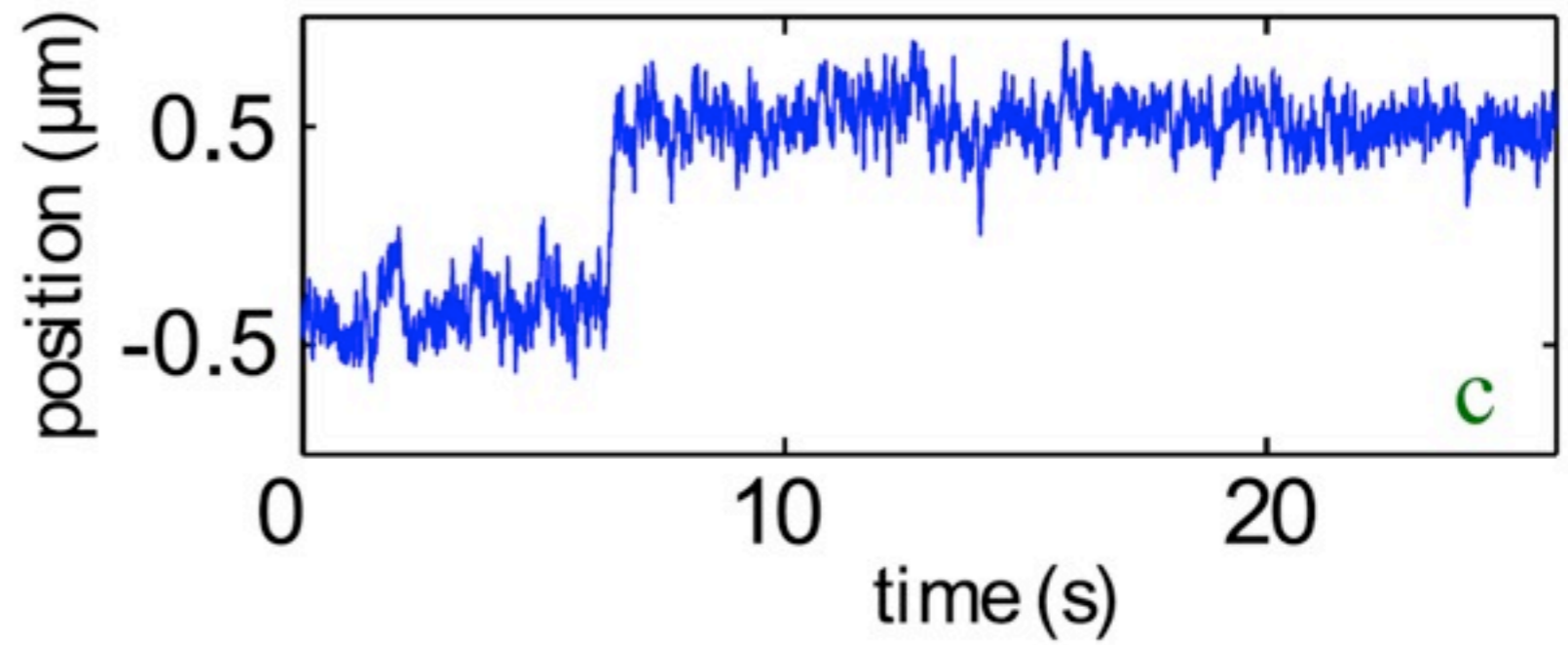
0 to 1 transition



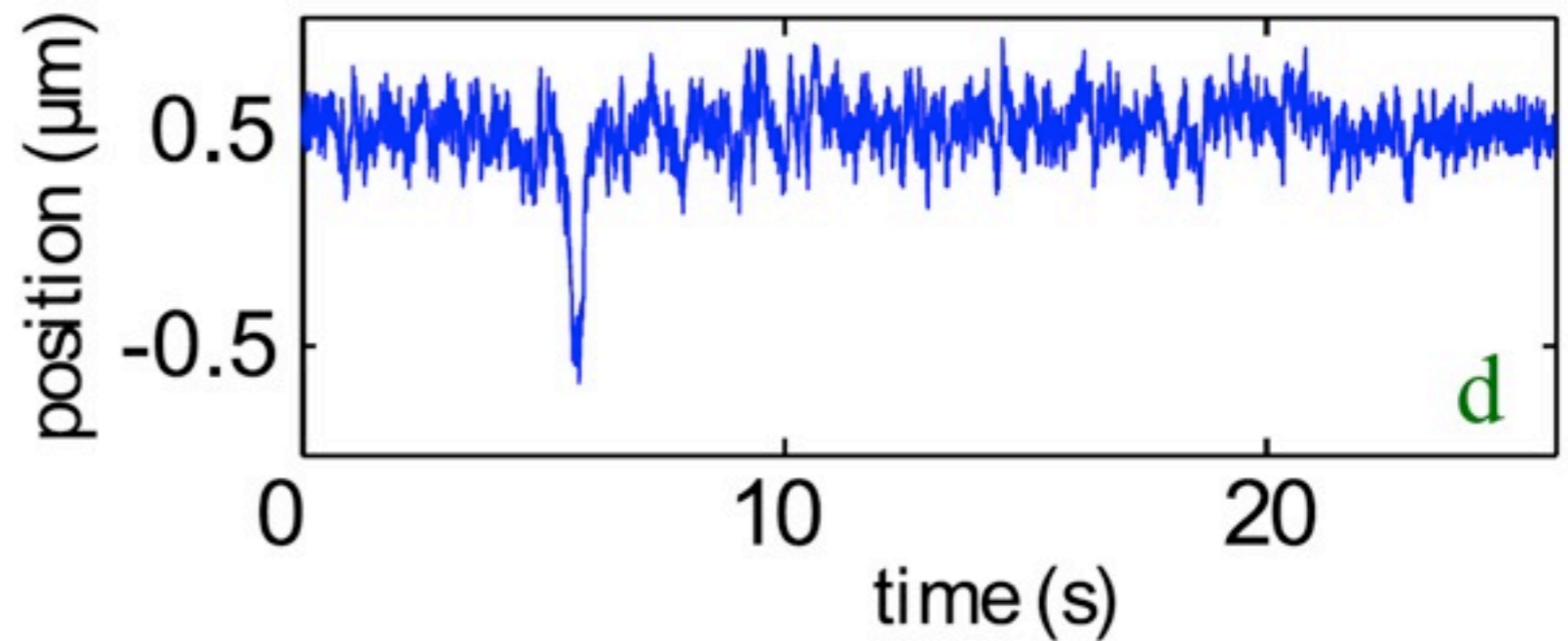
# Bead trajectories



0 to 1 transition



1 to 1 transition



$$\nu \dot{x} = -\frac{\partial U_o(x, t)}{\partial x} + F(t) + \eta$$

multiplying by  $\dot{x}$  and integrating for a time  $\tau$  we get :

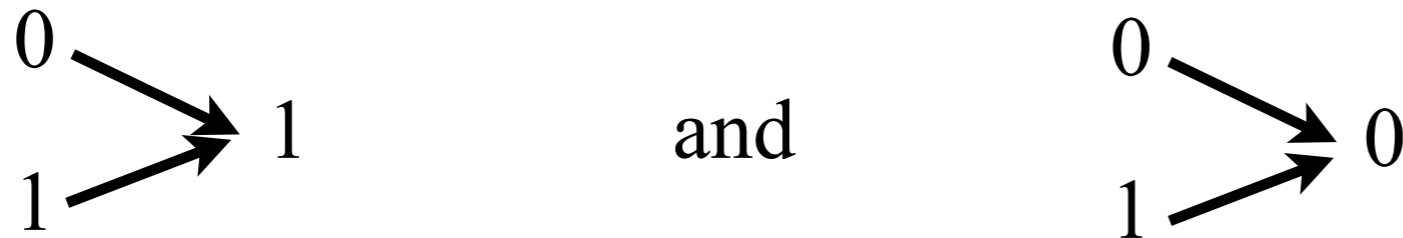
$$\Delta U_\tau = W_\tau - Q_\tau \quad \text{Stochastic thermodynamics}$$

$$\Delta U_\tau = -\int_0^\tau \frac{\partial U_o}{\partial x} \dot{x} dt \quad W_\tau = \int_0^\tau F \dot{x} dt$$

$$Q_\tau = \int_0^\tau \nu \dot{x}^2 dt - \int_0^\tau \eta \dot{x} dt$$

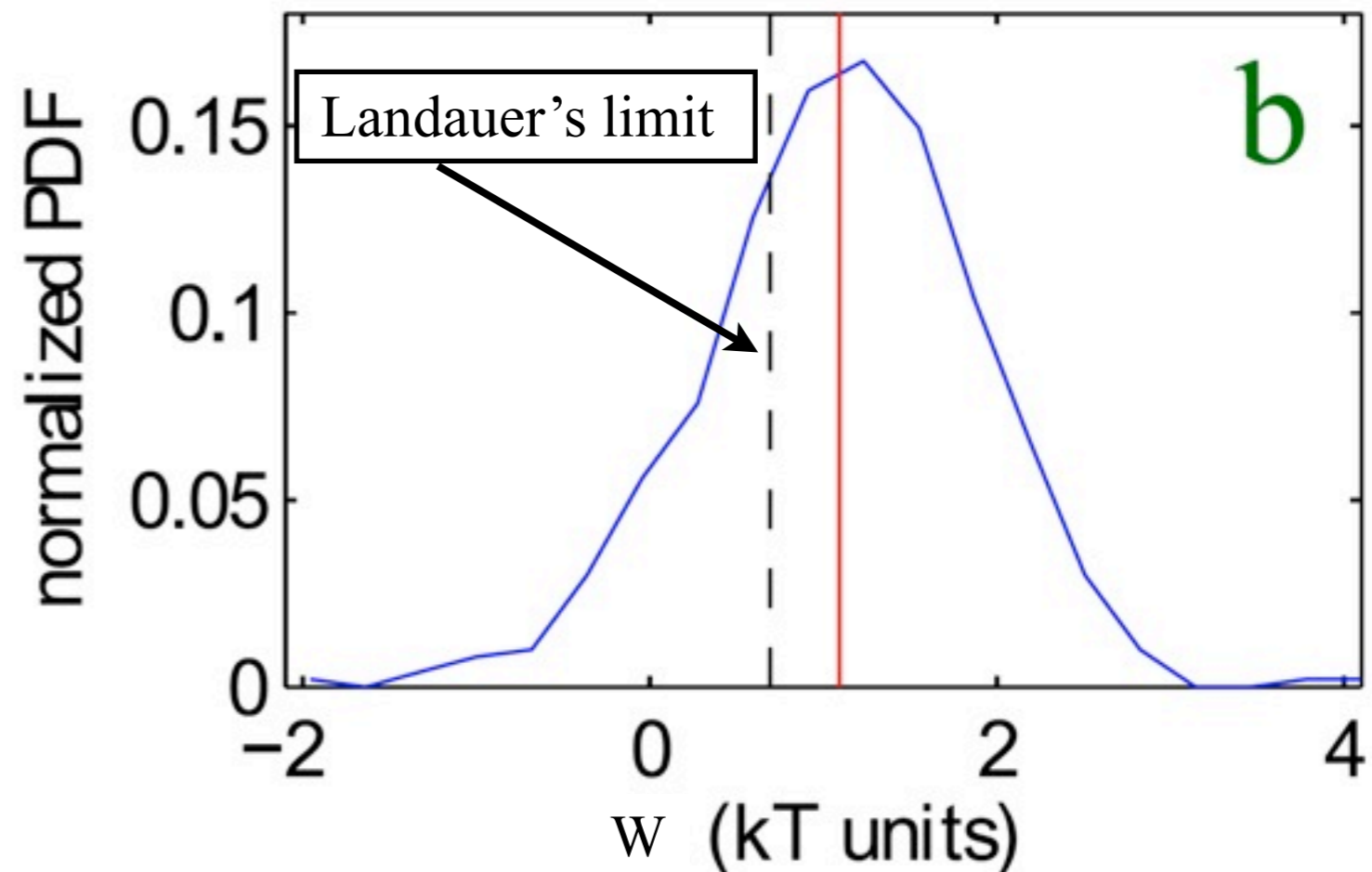
Sekimoto K, Progress of Theoretical Phys. supplement (130), 17 (1998).

The two erasure cycles have been considered

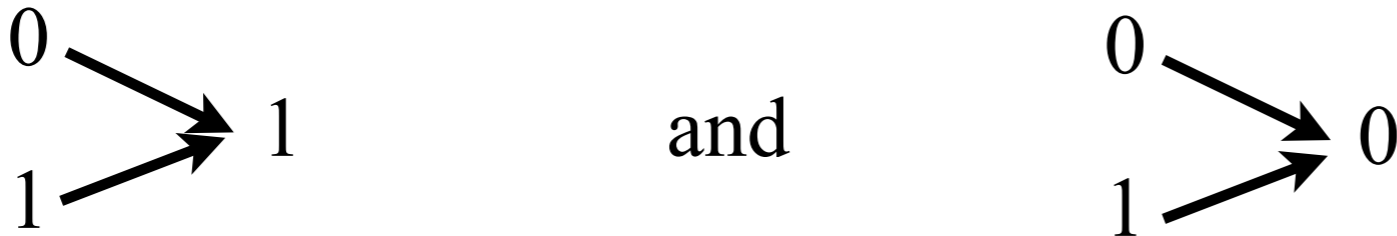


$$W_F = - \int_0^{\tau_{cycle}} \nu v(t) \dot{x} dt = \int_0^{\tau_{cycle}} F_{max} \frac{t}{\tau} \dot{x} dt$$

$$\Delta U_\tau = - \int_0^{\tau_{cycle}} \frac{\partial U_o}{\partial x} \dot{x} dt$$

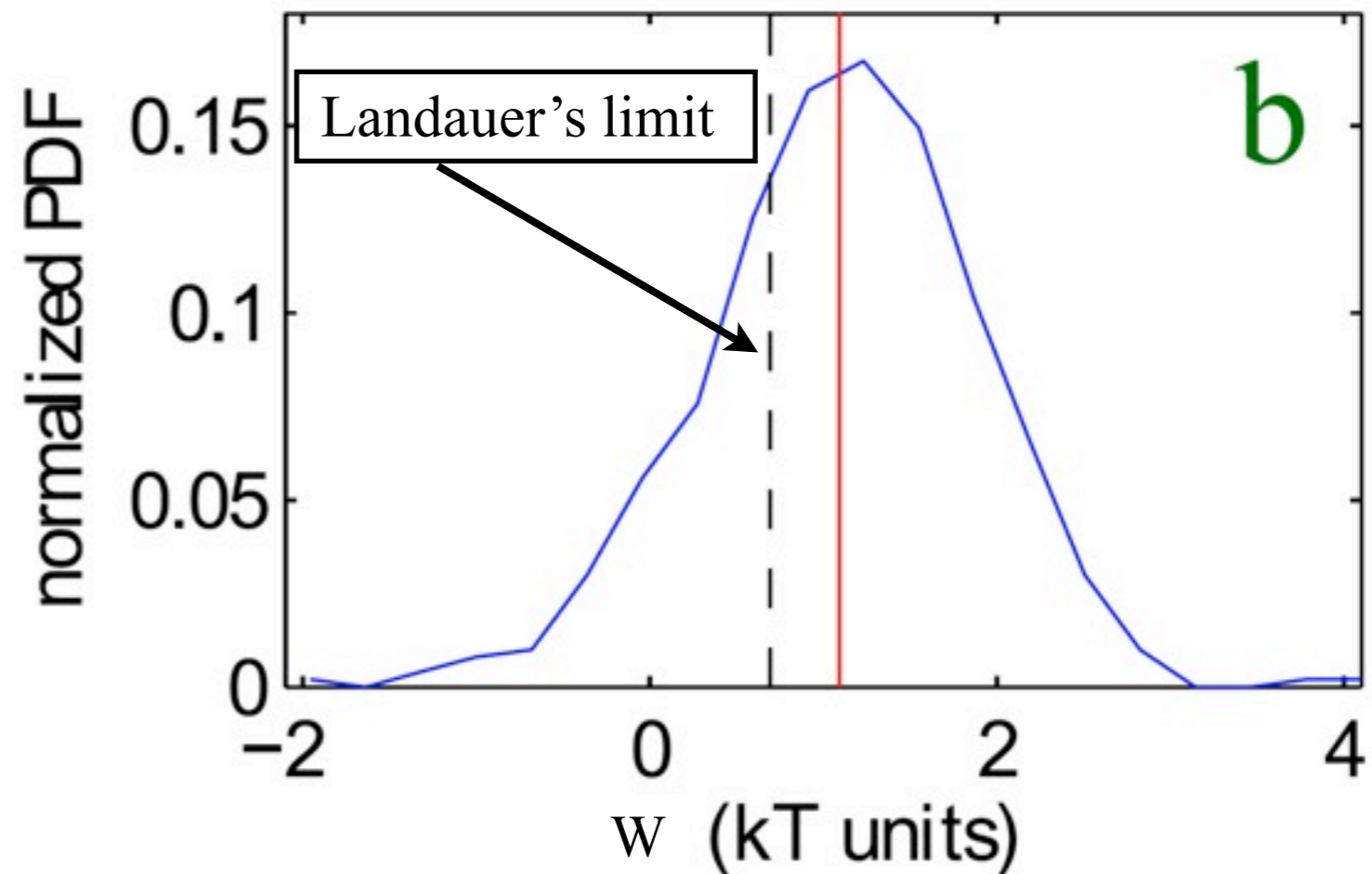


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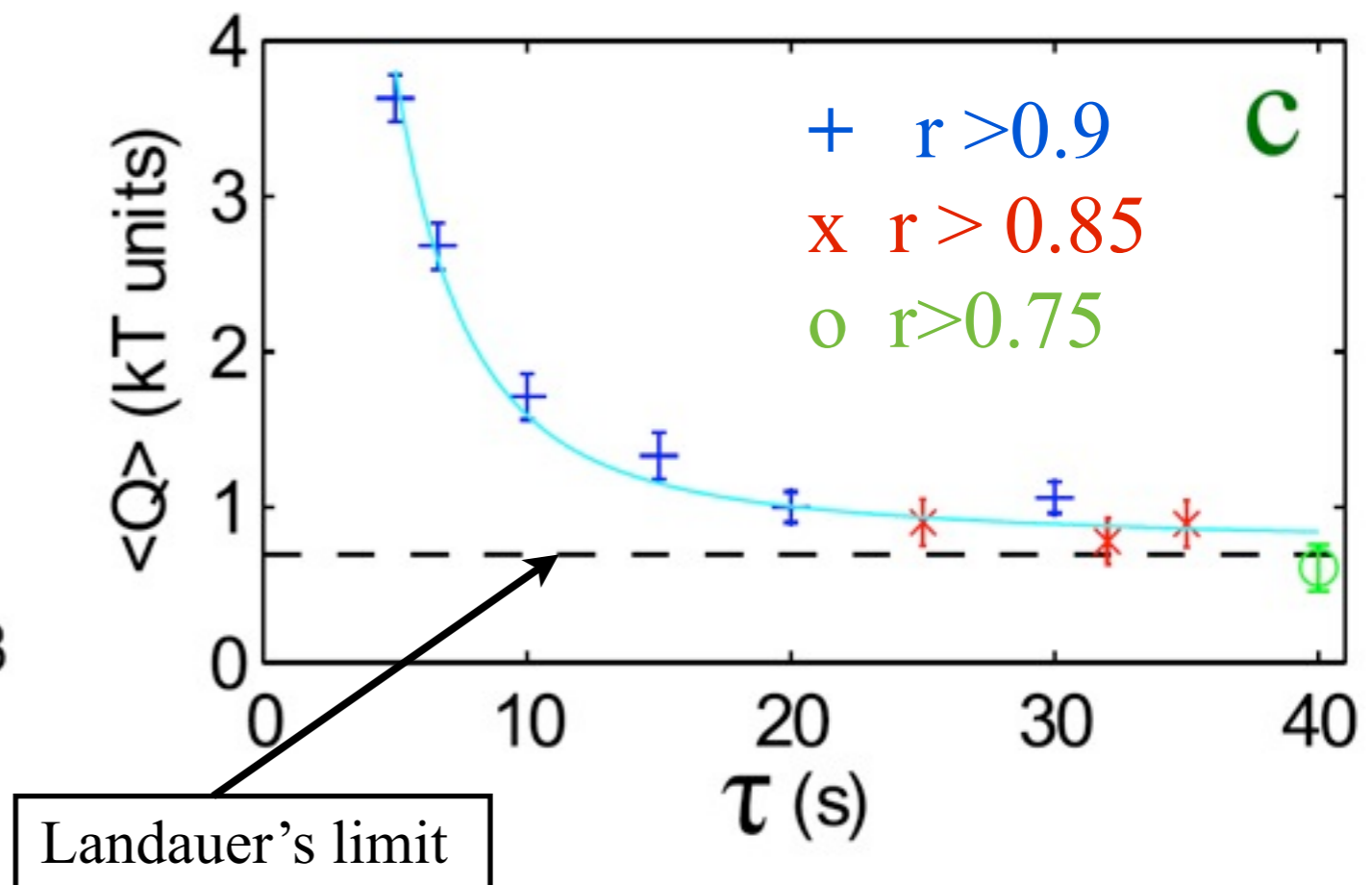
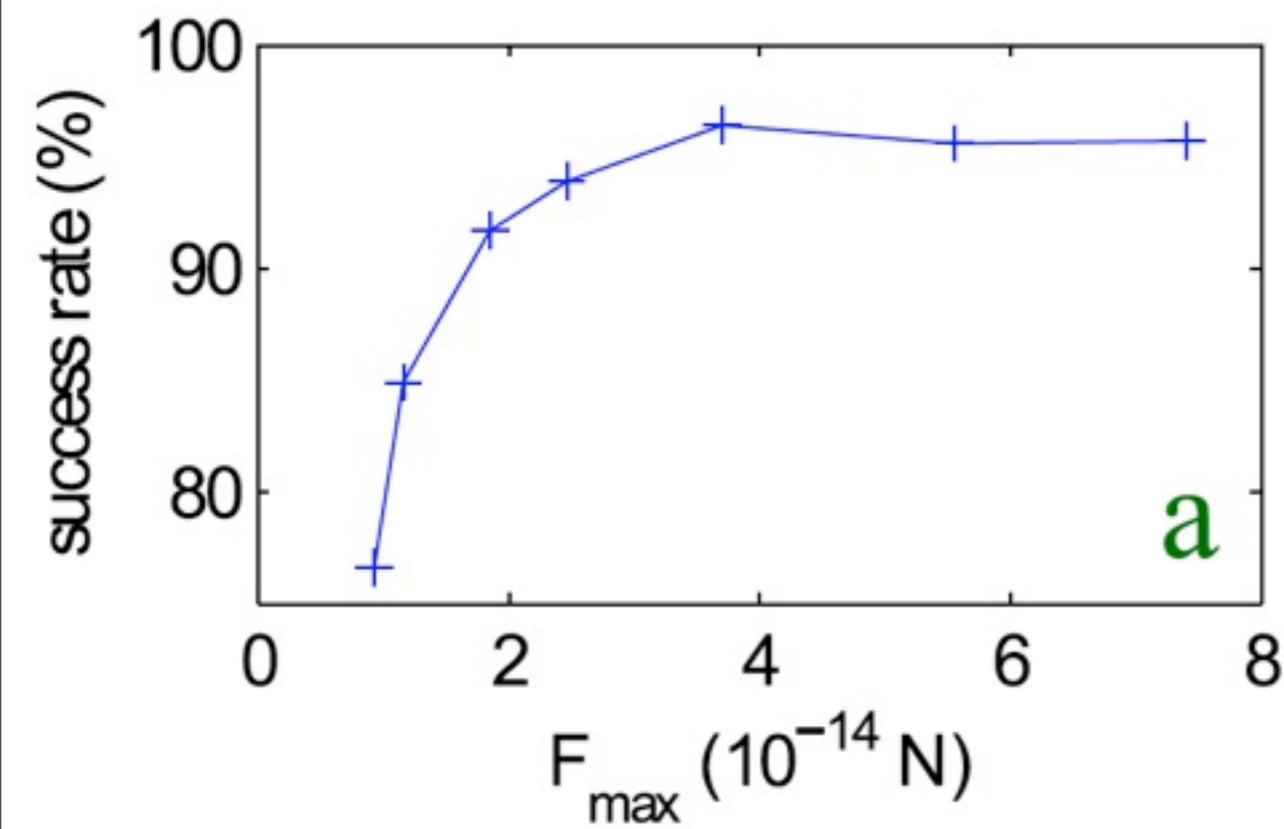
~~$$\Delta U_\tau = - \int_0^{\tau_{cycle}} \frac{\partial U_0}{\partial x} \dot{x} dt$$~~



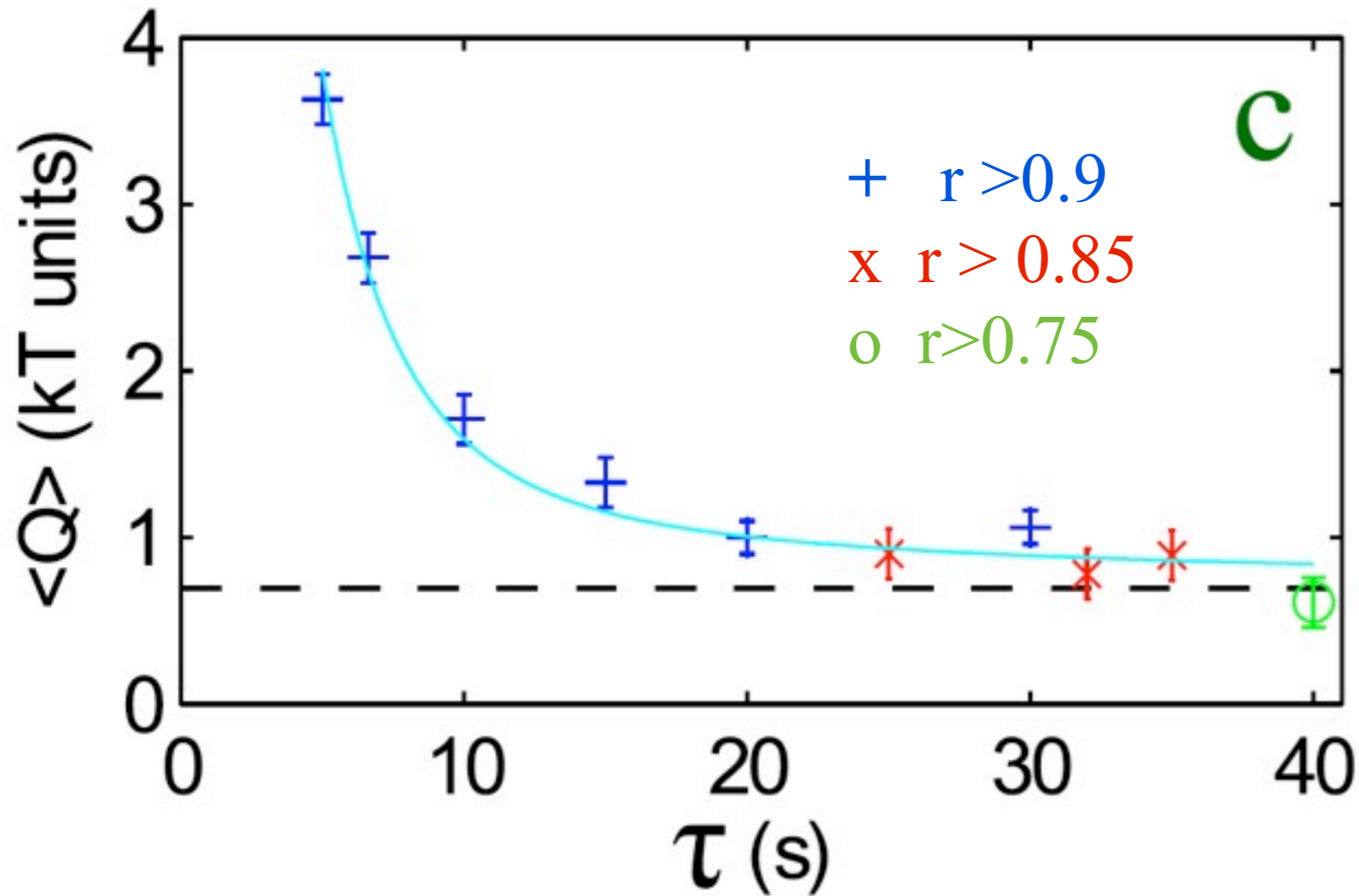
$$\text{Success rate } r = \frac{\text{number of successful cycles}}{\text{Total number of cycle}}$$

Qualitative observations :

- At constant  $\tau$  :  $W$  and  $r$  increase with  $F_{\max}$
- At constant  $F_{\max}$  :  $W$  decreases and  $r$  increases for increasing  $\tau$

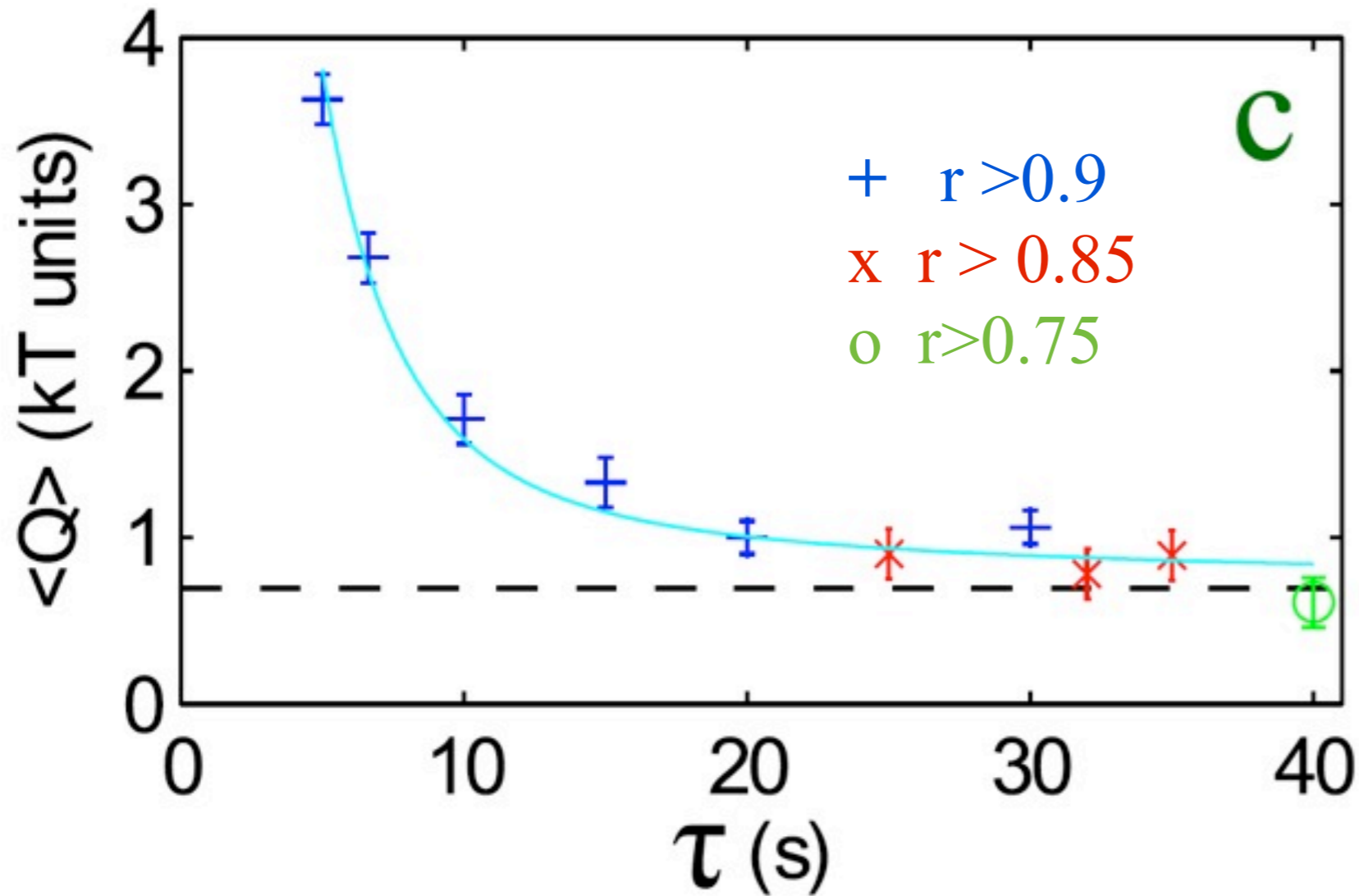






Landauer's limit as a function of  $r$

$$\langle Q \rangle_{\text{Landauer}}^r = kT [\ln 2 + r \ln r + (1 - r) \ln(1 - r)]$$

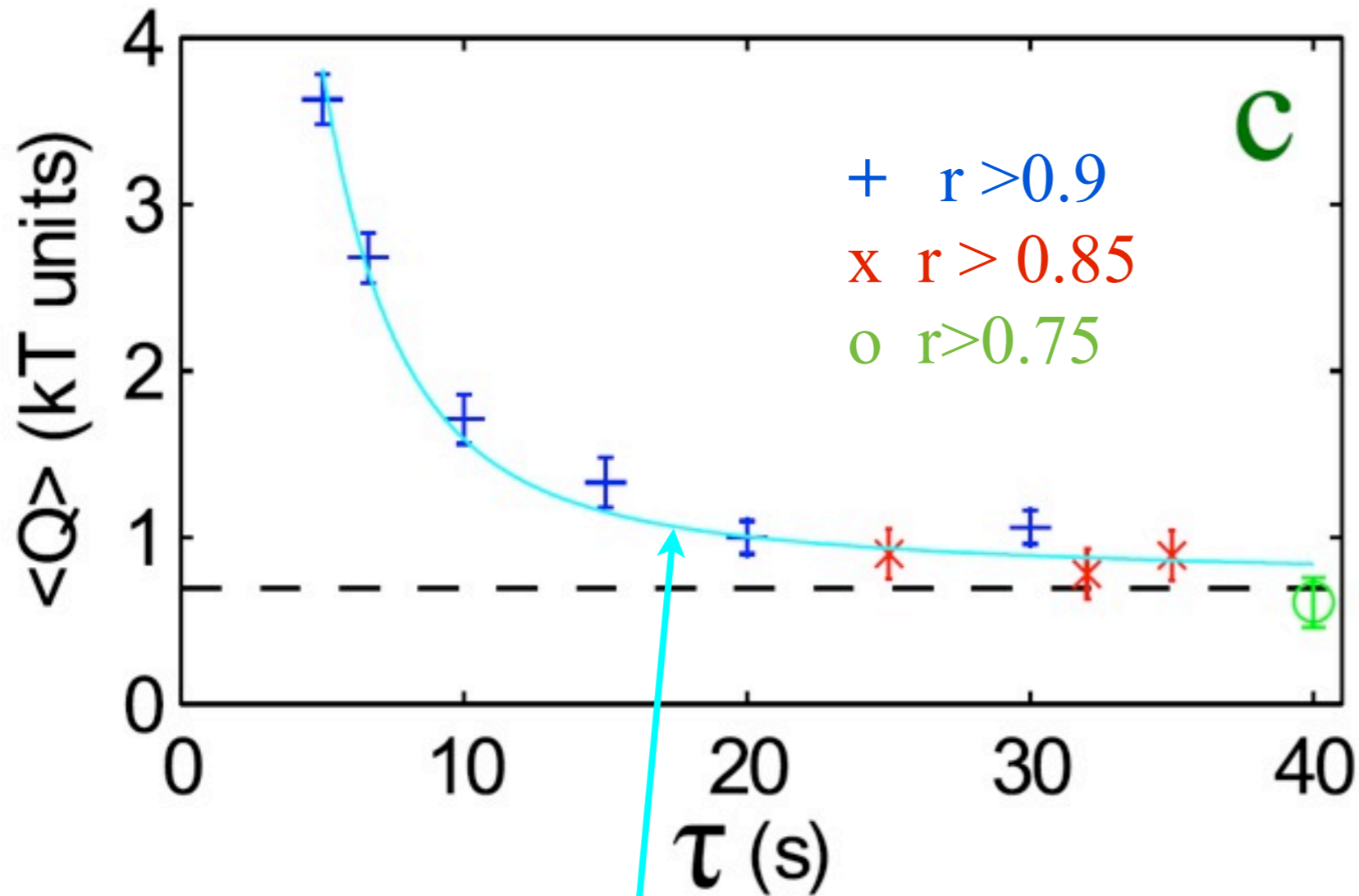


Landauer's limit as a function of  $r$

$$\langle Q \rangle_{\text{Landauer}}^r = kT [\ln 2 + r \ln r + (1 - r) \ln(1 - r)]$$

At  $r=0.5$        $\langle Q \rangle_{\text{Landauer}}^r = 0$

Indeed the Erasure Procedure left the initial state unchanged



$$\Delta F = \Delta U - T\Delta S$$

Asymptotic behaviour

$$\tau \rightarrow \infty$$

Sekimoto -Sasa J. Phys. Soc. Jpn. 66, 3326 (1997).

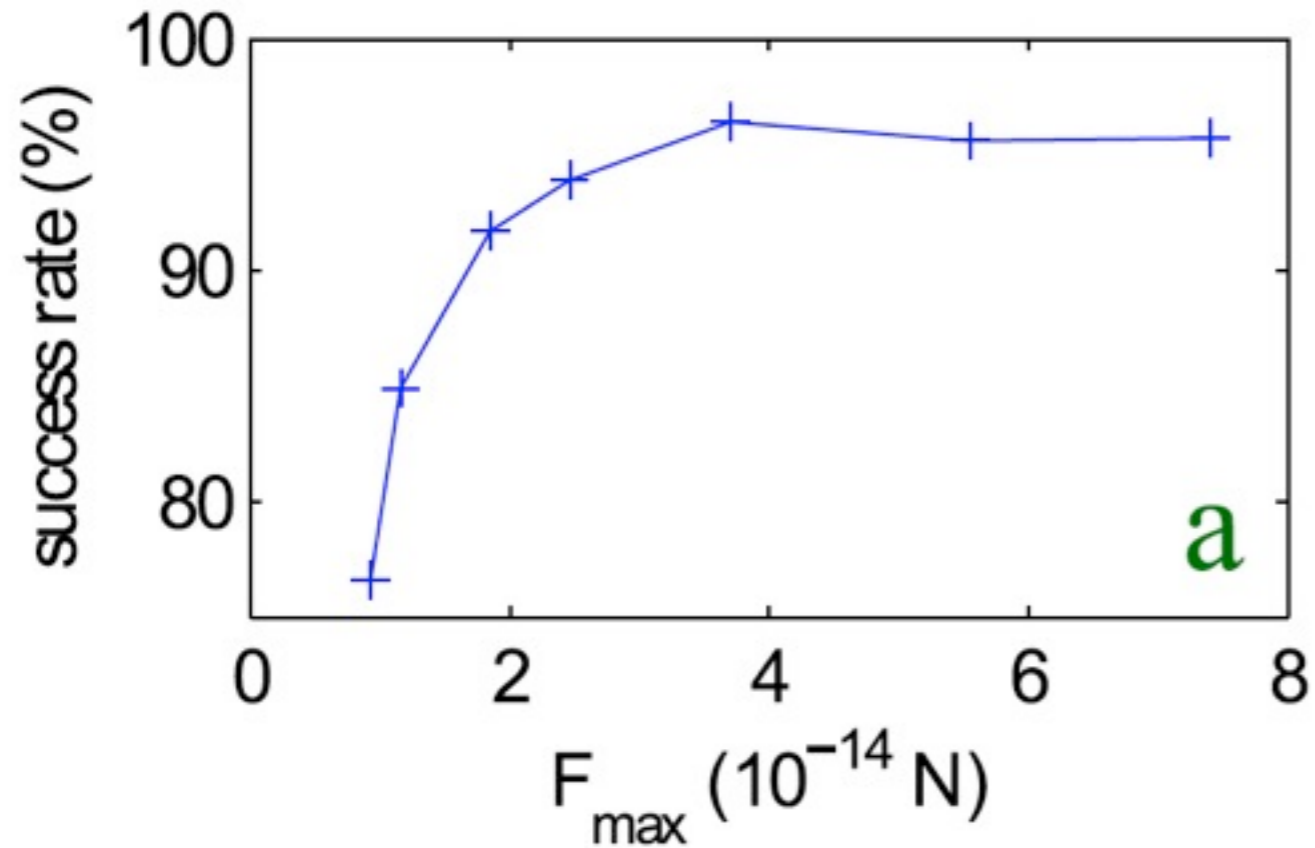
$$\langle W \rangle \simeq \Delta F + B/\tau$$

As  $\langle \Delta U \rangle = 0$  then  $\Delta F = -T\Delta S$  and  $\langle Q \rangle = \langle W \rangle \simeq kT \ln 2 + B/\tau$

$$\langle Q \rangle = \langle Q \rangle_{\text{Landauer}} + [A \exp(-t/\tau_K) + 1] B/\tau$$

$$\tau_K = \tau_0 \exp\left[\frac{\Delta U}{k_B T}\right] \text{ is the Kramers time}$$

## The success rate $r$



Why in the experiment  $r < 1$  ?

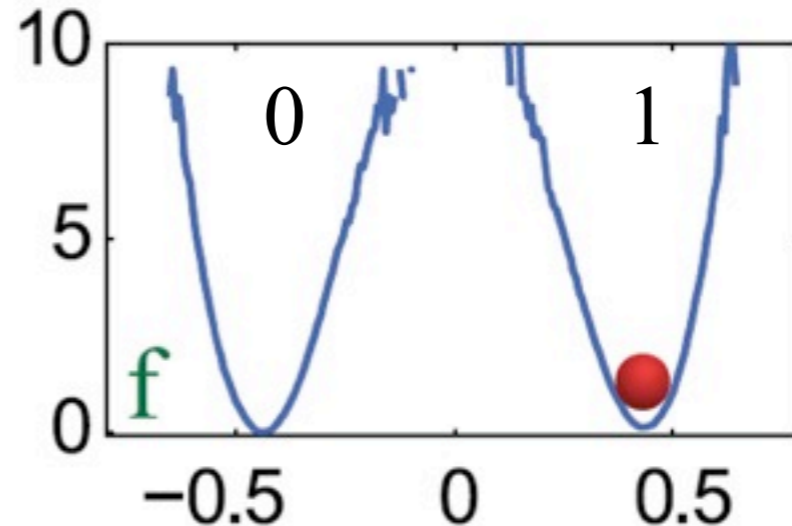
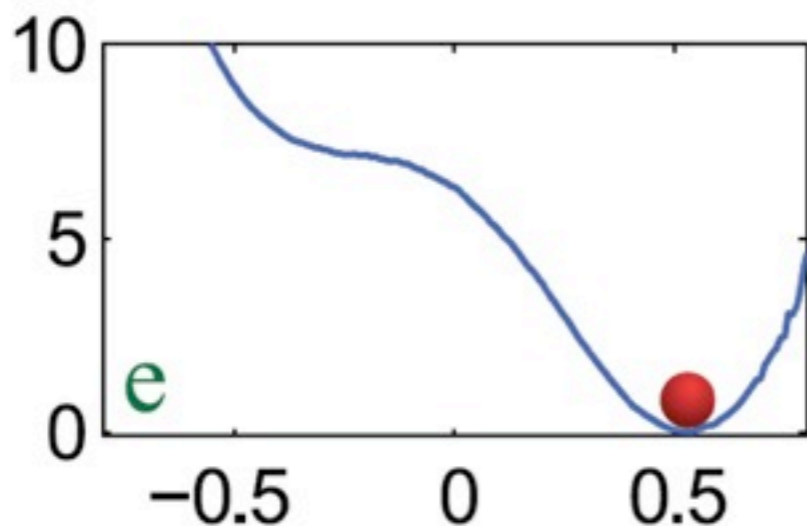
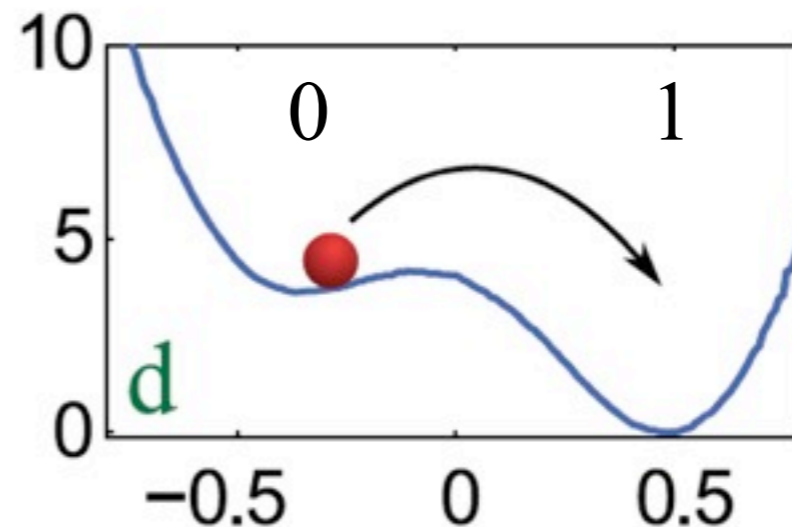
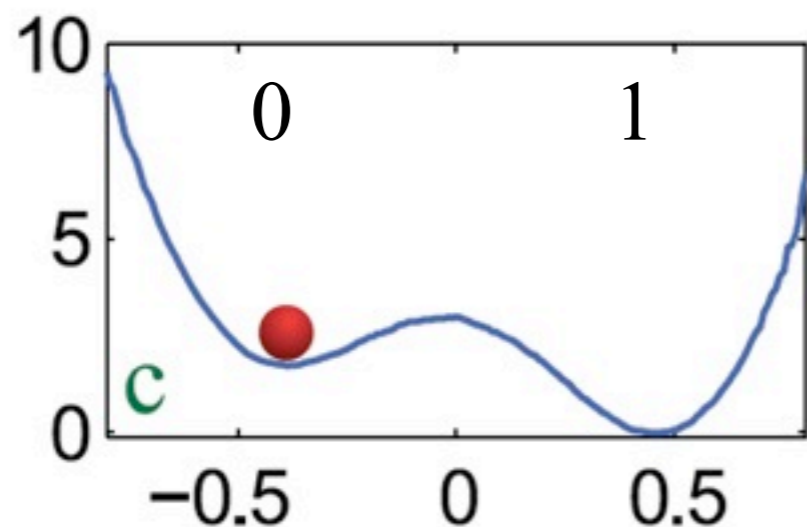
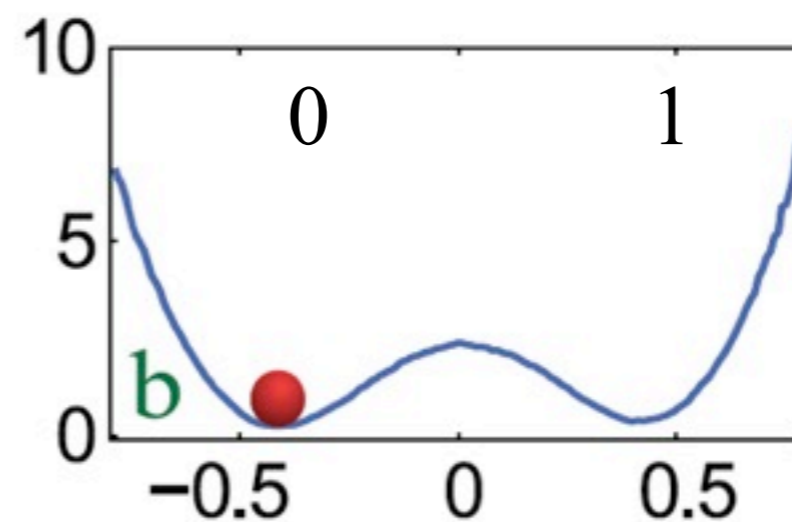
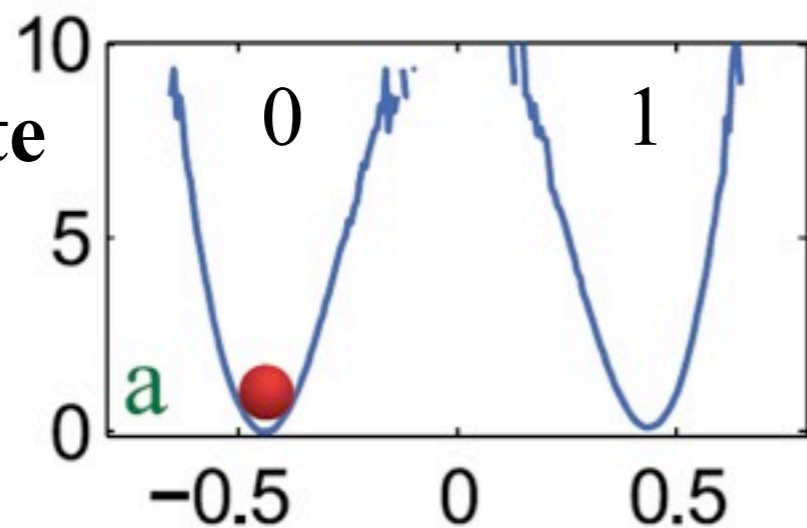
Is this result produced by 3D effects of the trap ?

Is the finite height of the initial barrier responsible of  $r < 1$  ?

# The Erasure Procedure

Initial state

$U(x)$  (k<sub>B</sub>T)

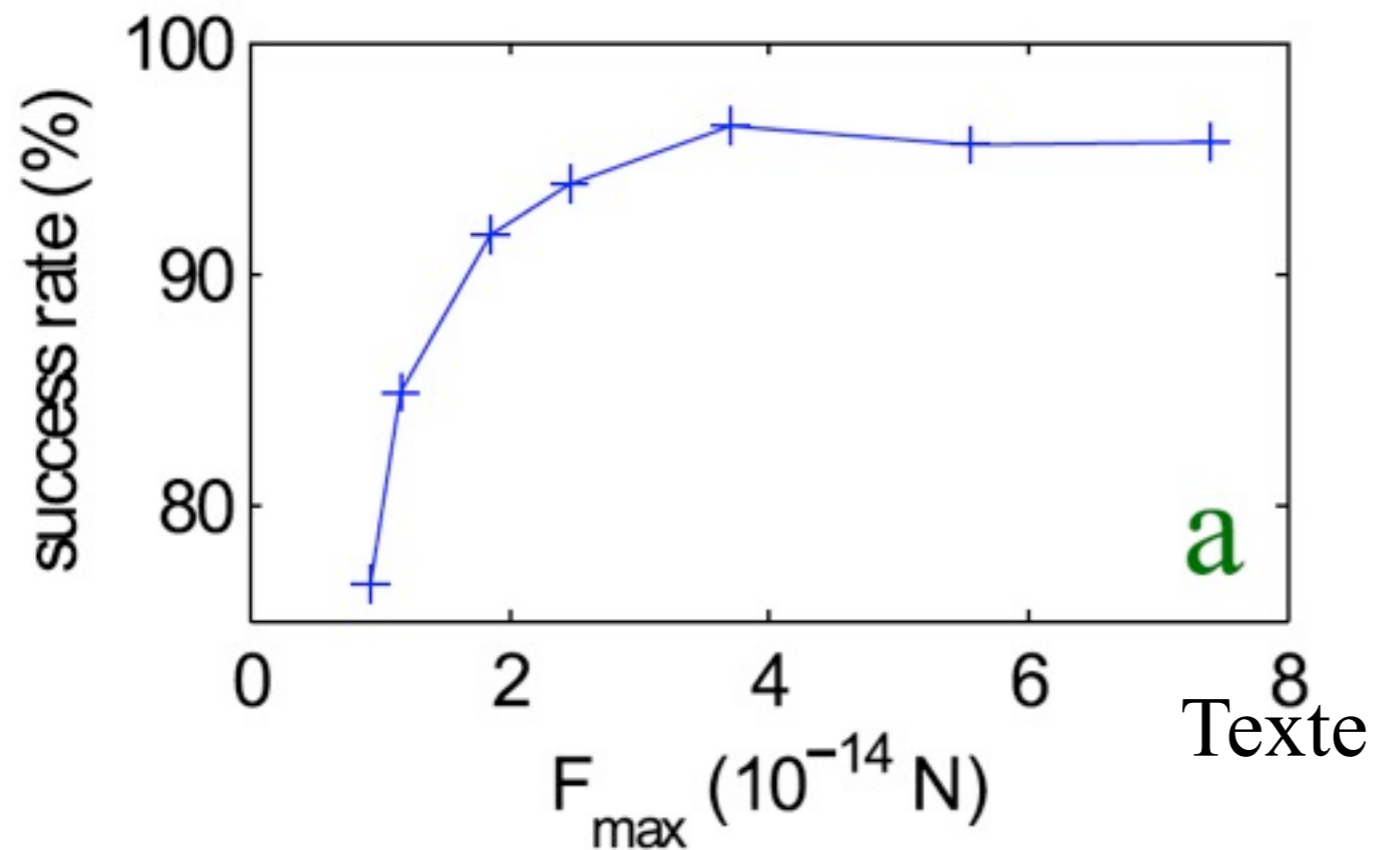


$x$  (μm)

$x$  (μm)

Final state

## The success rate $r$



Why in the experiment  $r < 1$  ?

Is this result produced by 3D effects of the trap ?

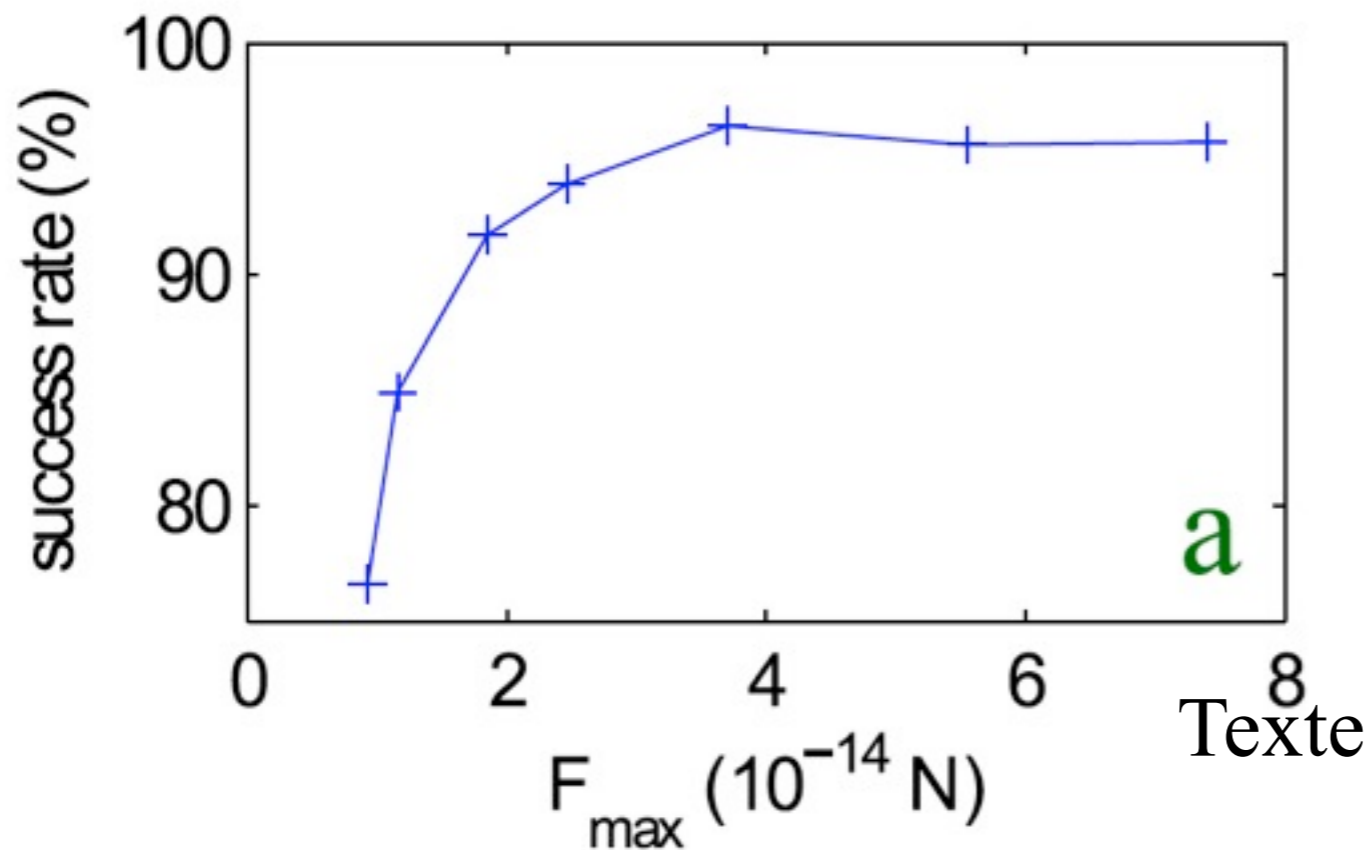
Is the finite height of the initial barrier responsible of  $r < 1$  ?

## Numerical test

We use all the experimental parameters and procedure

with two different initial barriers  $8k_B T$  and  $15k_B T$

## The success rate $r$



Why in the experiment  $r < 1$  ?

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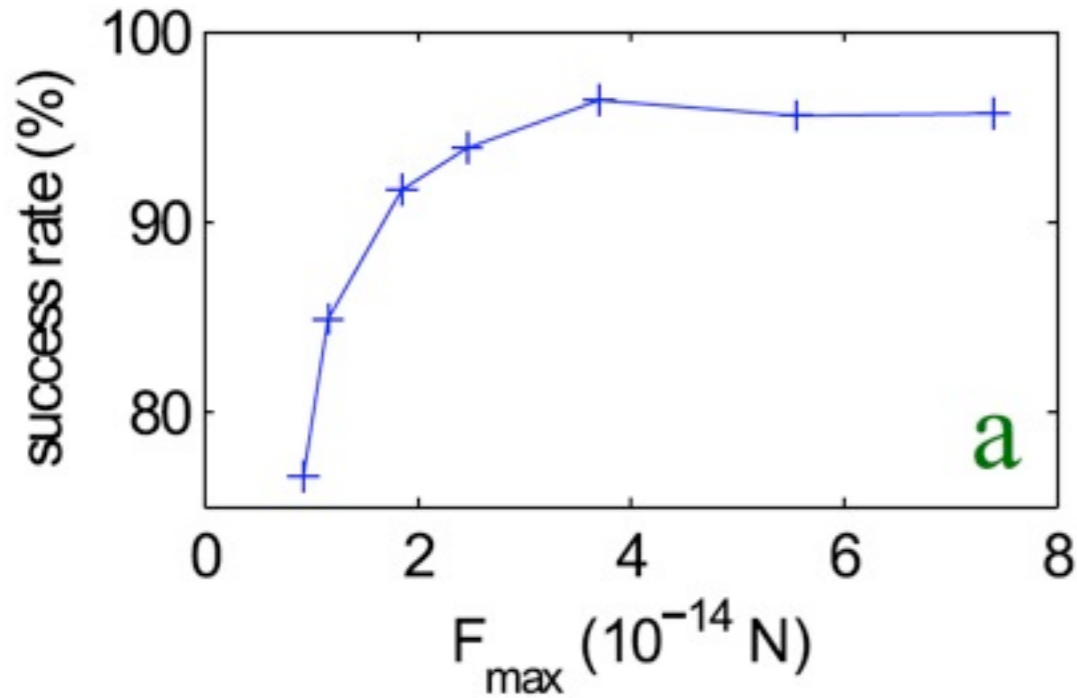
### Numerical test

$$\nu \dot{x} = -\frac{\partial U(x, t)}{\partial x} + F(t) + \eta$$

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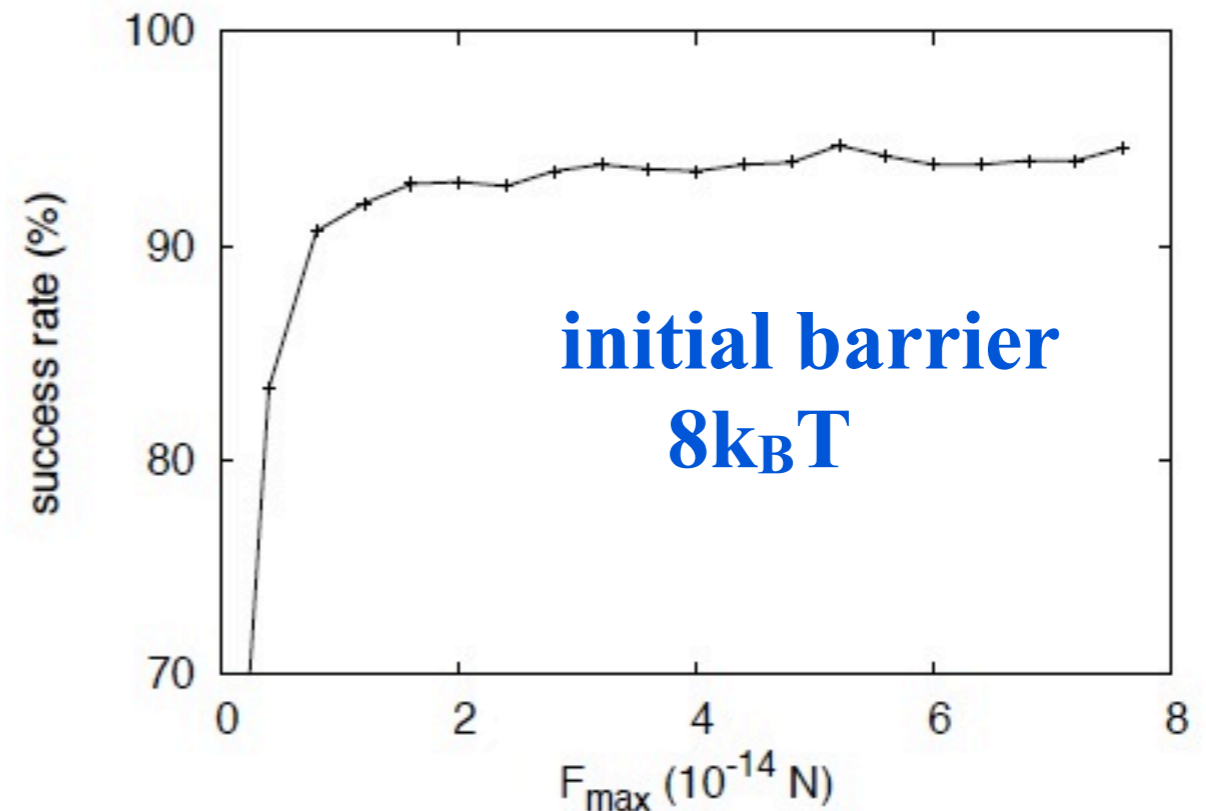
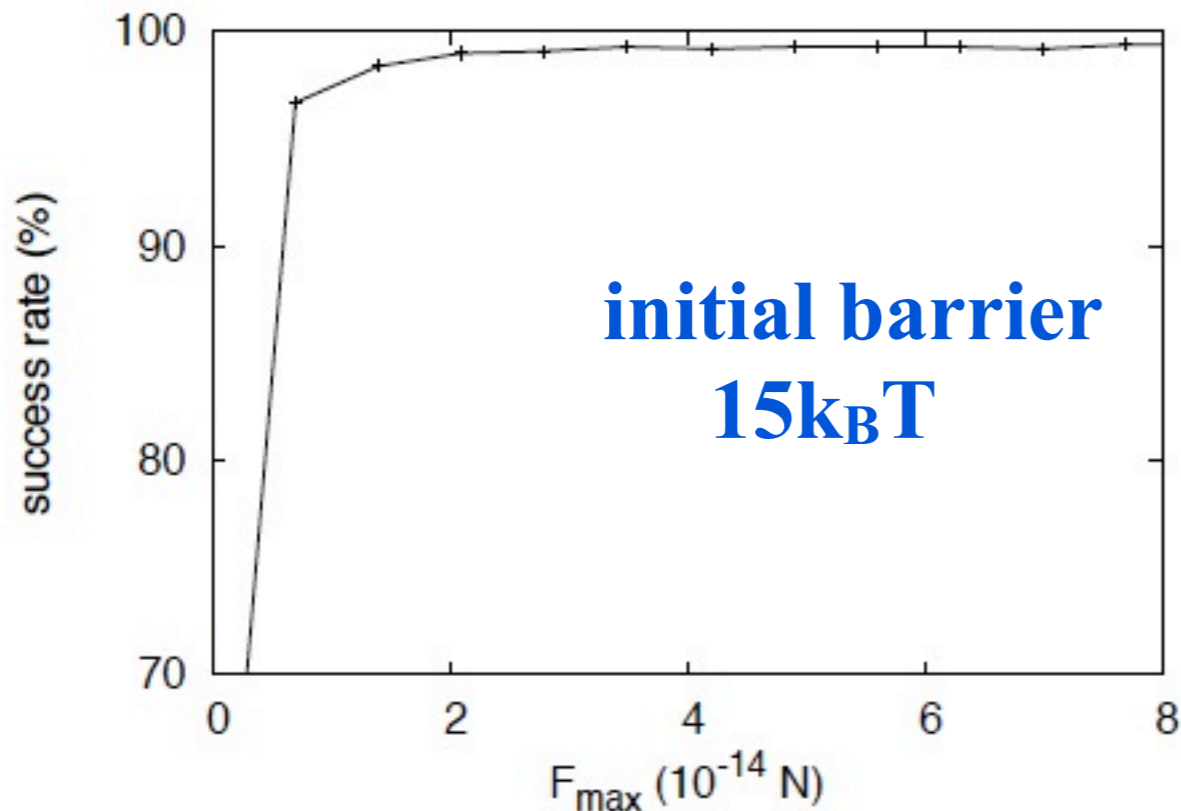
# The success rate $r$



Why in the experiment  $r < 1$  ?  
 Is this result produced by 3D effects of the trap ?  
 Is the finite height of the initial barrier responsible of  $r < 1$  ?

## Numerical test

$$\nu \dot{x} = -\frac{\partial U(x, t)}{\partial x} + \eta$$





- Our experimental results indicate that the thermodynamic limit to information erasure, the Landauer bound, can be approached in the quasistatic regime, but not exceeded.
- The asymptotic limit is reached in  $1/\tau$  for  $\tau > 3 \tau_k$
- The fact that  $r < 1$  is due to the finite height of the initial barrier
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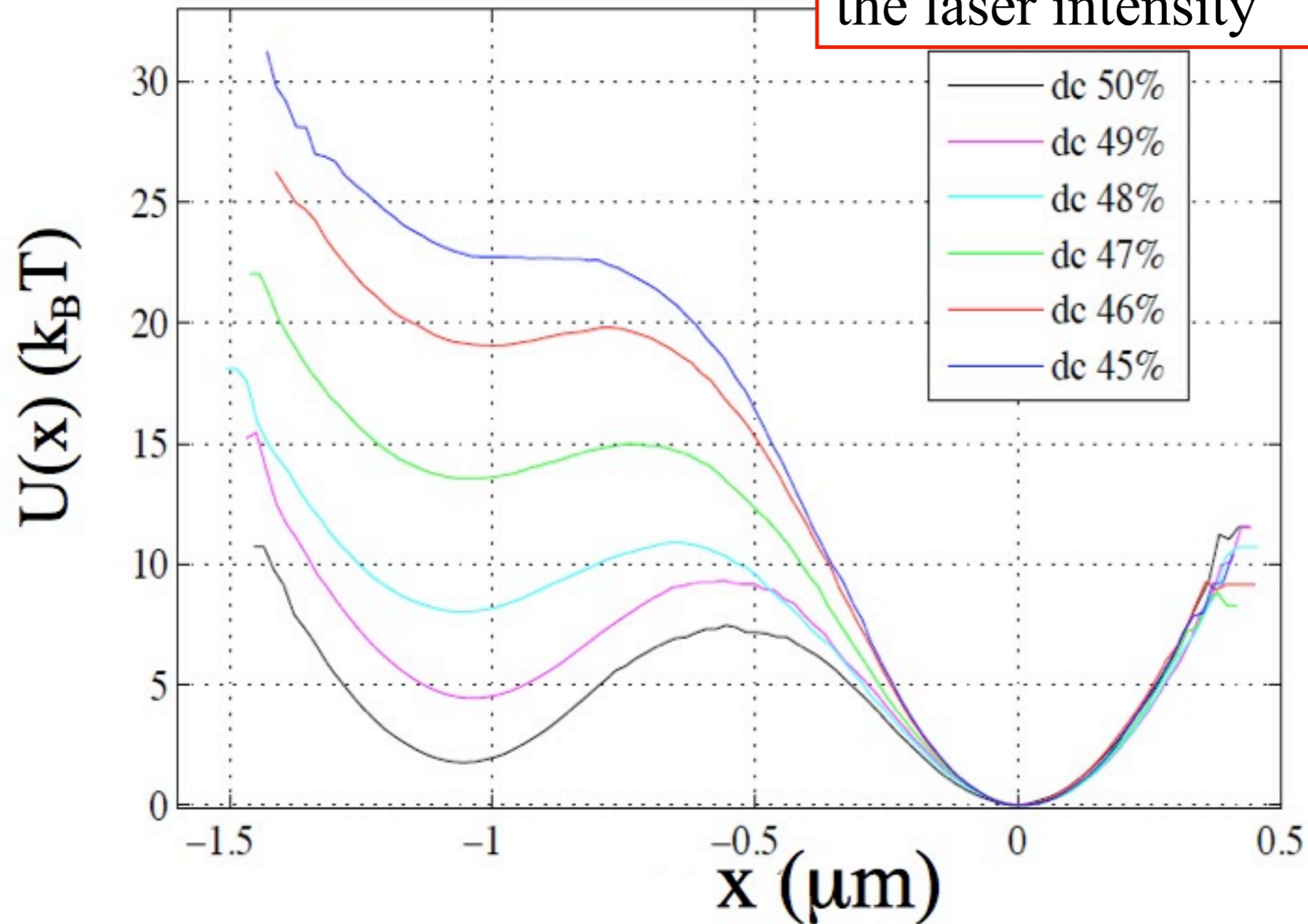
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See recent paper on optimisation : E. Aurell, K. Gawedzki

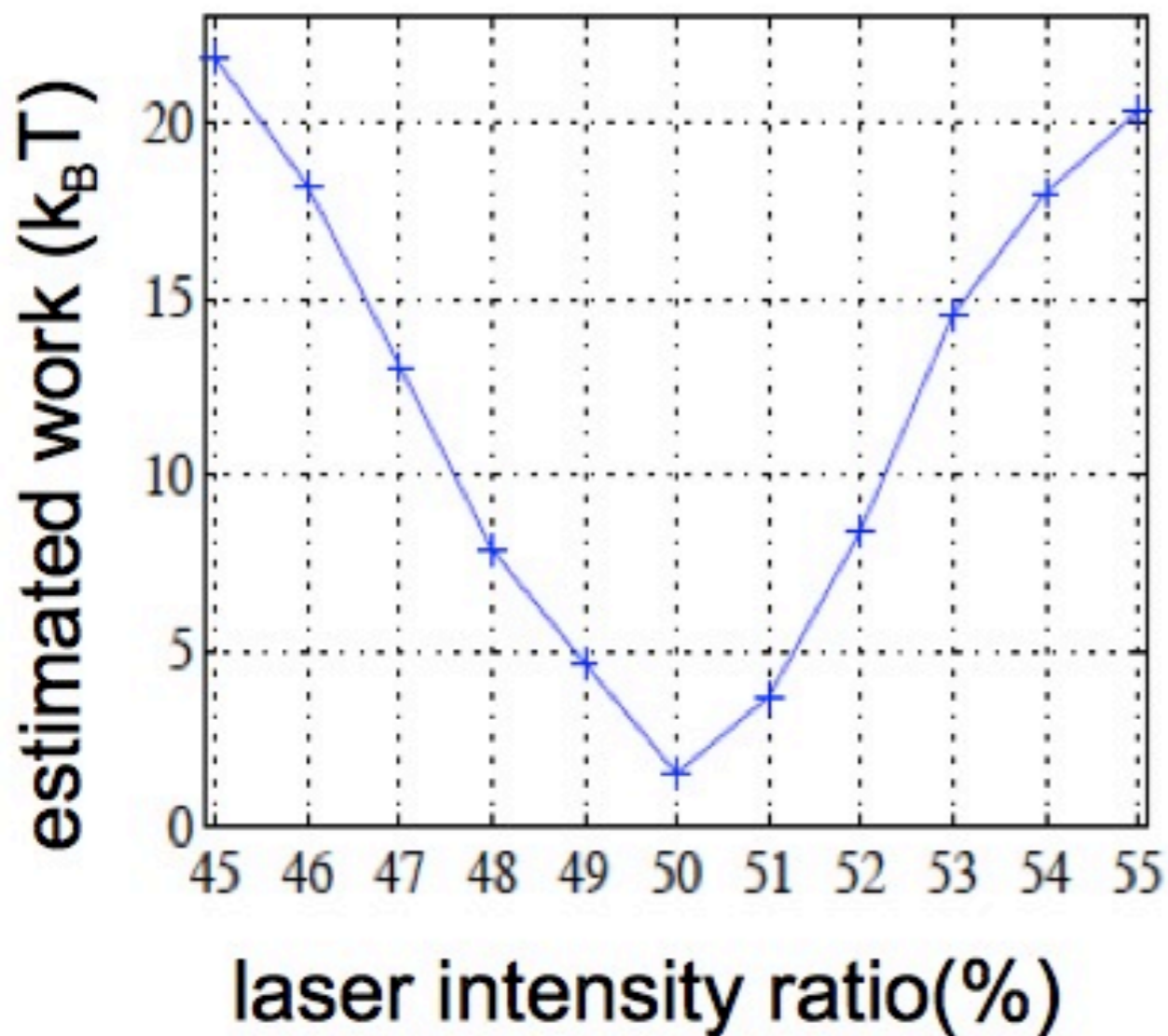
## Other procedure (I)

Relative change of the laser intensity

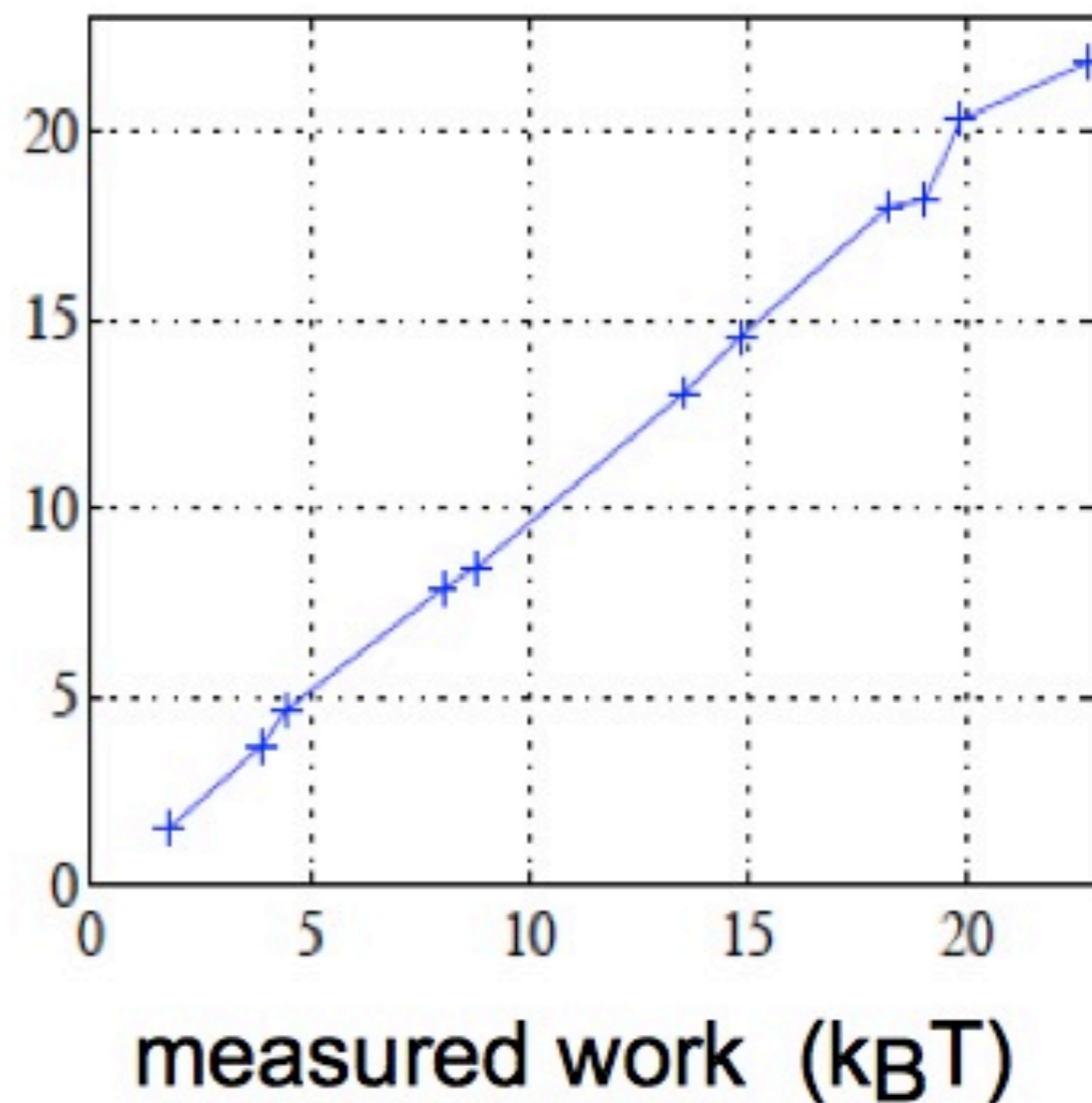


The ramping time of the laser intensity has been changed from 1s to 50s

Fixed intensity ratio



Ramp of intensity ratio



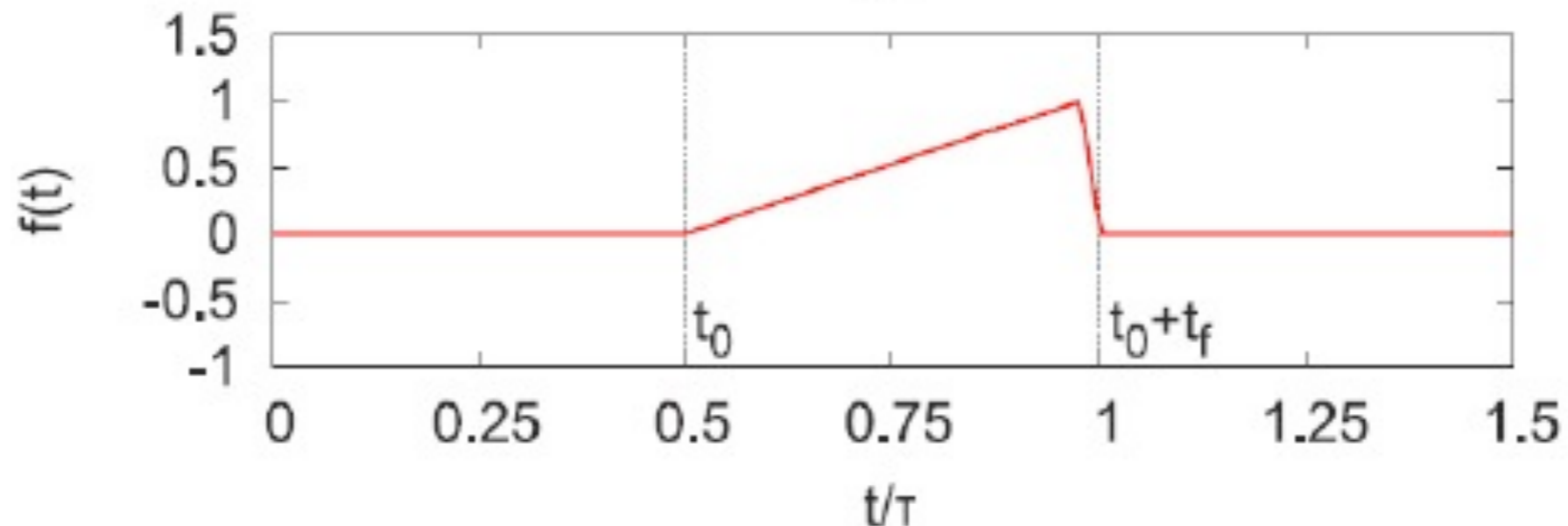
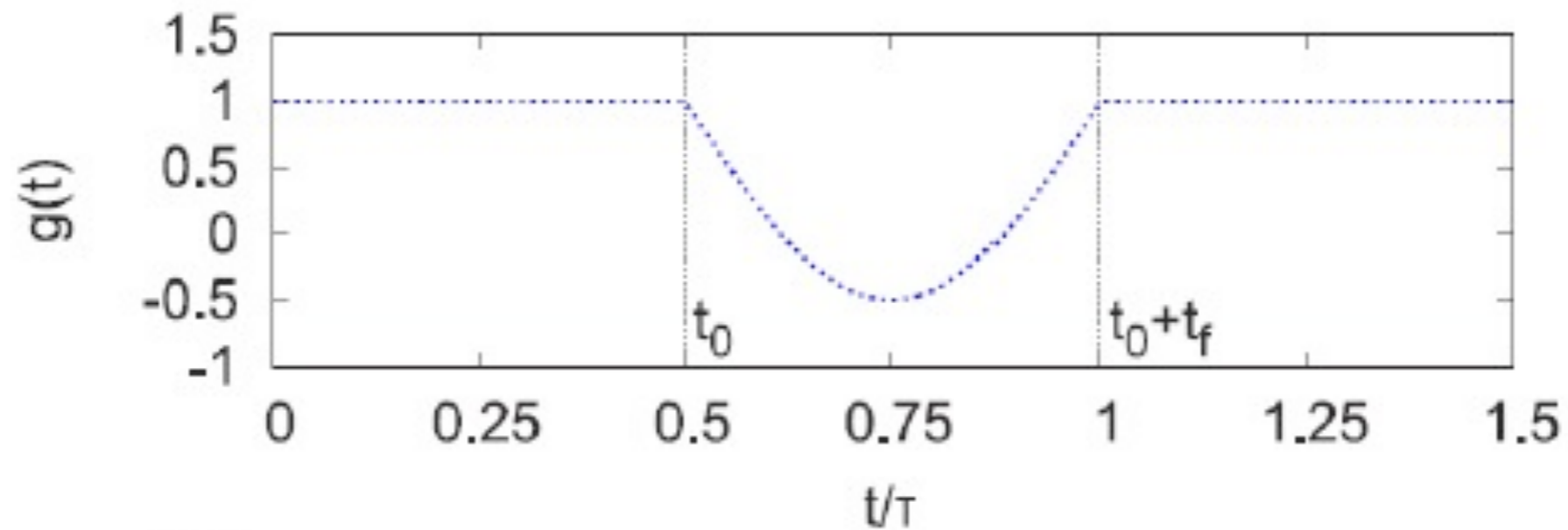
**The work is mainly due to the jump of the particle**  
**The Landauer limit can never be reached**

*Memory Erasure in Small Systems,*

R. Dillenschneider and E. Lutz, Phys. Rev. Lett. 102, 210601 (2009)

Potential : 
$$V(x, t) = -\frac{1}{2}g(t)x^2 + \frac{1}{4}x^4$$

External force : 
$$Af(t)$$



## Non-dimensional numbers and the success rate

$$\bar{\tau} = \frac{\tau}{\tau_k}$$

Possibility of jumping the barrier without force

$$\bar{F} = \frac{\delta x F_{max}}{\Delta U}$$

The maximum external work overcomes the barrier

$\tau_K = \tau_o \exp\left[\frac{\Delta U}{k_B T}\right]$  is the Kramers time with  $\tau_o \simeq 1s$

$\delta x$  is the distance of the potential minima

One can think that the success rate is :

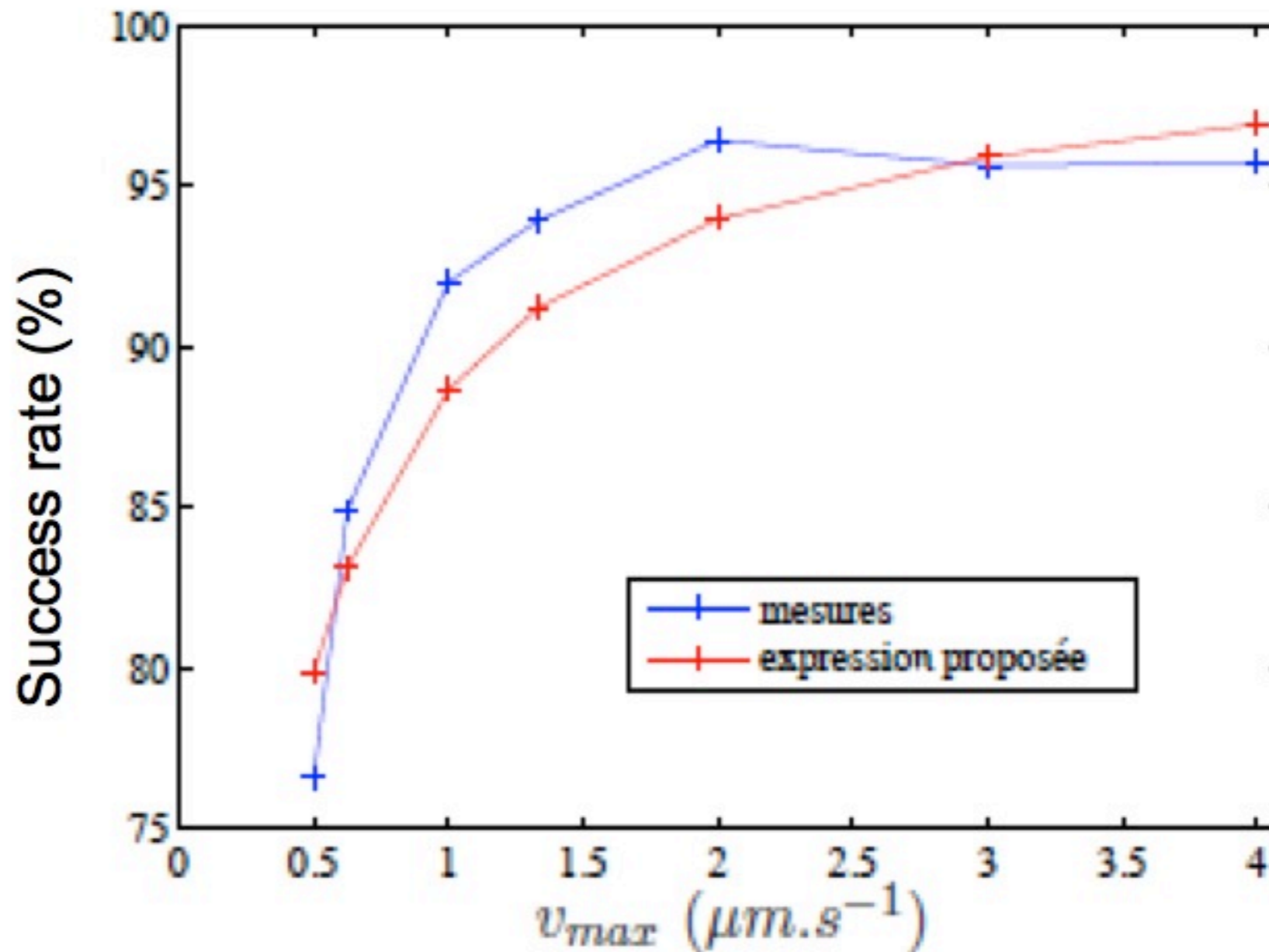
$$r = \frac{1}{2} \left[ 1 + \exp\left(-\frac{1}{\bar{\tau} \bar{F}}\right) \right]$$



# Non-dimensional numbers and the success rate

**Experimentally**

$$r = \frac{1}{2} \left[ 1 + \exp\left(-\frac{a}{\bar{\tau} \bar{F}^2}\right) \right]$$



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