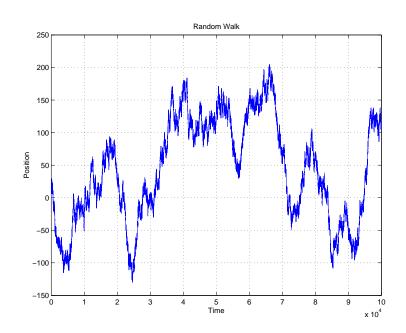
# How Can Random Noise Help Us

Global Transports from Thermal Fluctuations

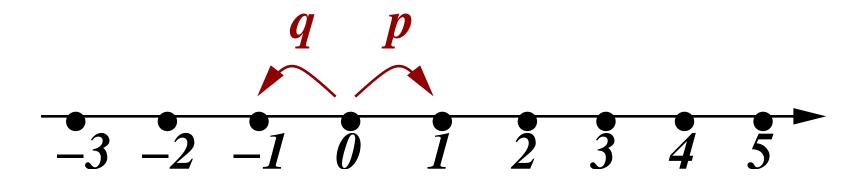
Aaron N. K. Yip
Department of Mathematics
Purdue University



# **Basics of Random Walk**

#### i.e. Drunken Walker

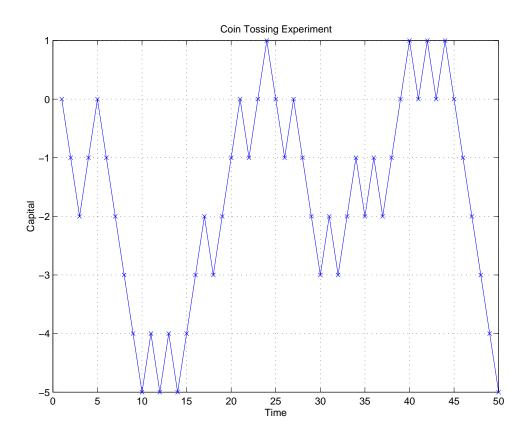
Start from the origin, to decide where to go next, you toss a coin, if the outcome is a head, you move one step to the right, if it is a tail, you move to the left.



Let  $X_i = 1$  or -1 if the *i*-th toss is a head or tail. Then your **position** after time n is given by:

$$S_n = X_1 + X_2 + \dots \times X_n$$

# Basics of Random Walk – 2



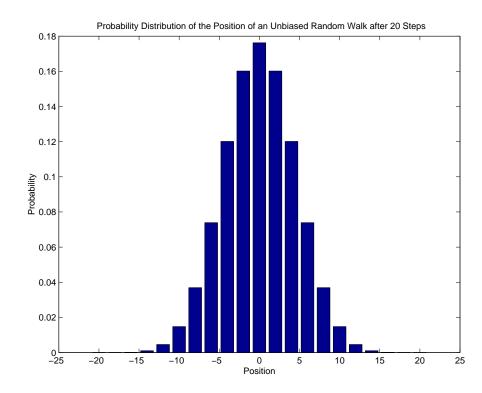
Suppose head comes up with probability p and tail with probability q = 1 - p. (If  $p = q = \frac{1}{2}$ , the coin is called fair.)

What is the **statistics** of your position,  $X_n$  (at time n)?

# **Binomial Distribution**

$$\operatorname{Prob}(S_n = j) = \begin{pmatrix} n \\ \frac{n+j}{2} \end{pmatrix} p^{\frac{n+j}{2}} q^{\frac{n-j}{2}}$$

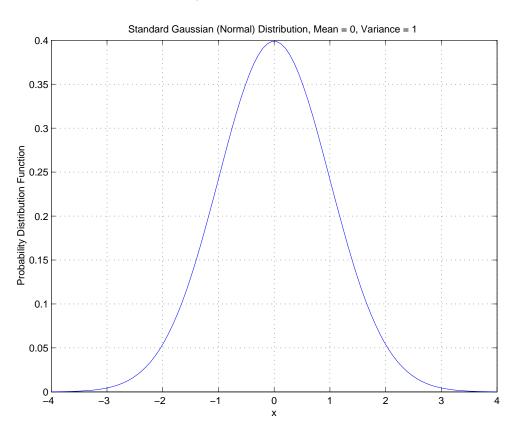
where 
$$\binom{n}{m} = \frac{n(n-1)(n-2)\cdots(n-m+1)}{m(m-1)(m-2)\cdots(2)(1)} = \frac{n!}{m!(n-m)!}$$



# Gaussian (Normal) Distribution

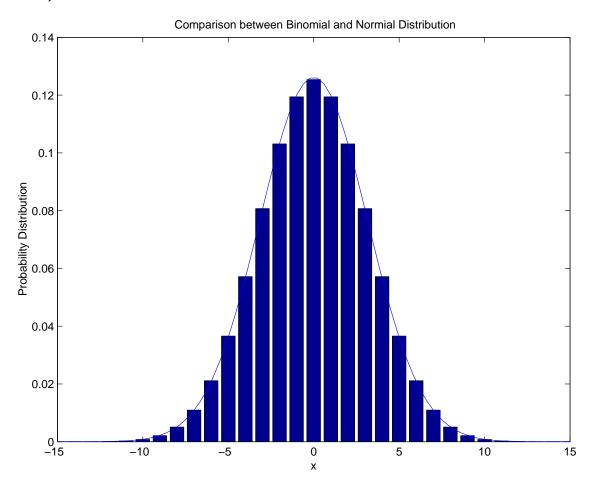
$$G_{\mu,\sigma}(x) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(x-\mu)^2}{2\sigma^2}}$$

$$\mathbf{Mean} = \mu, \ \ \mathbf{Variance} = \sigma^2$$



### **Binomial converges to Gaussian Distribution**

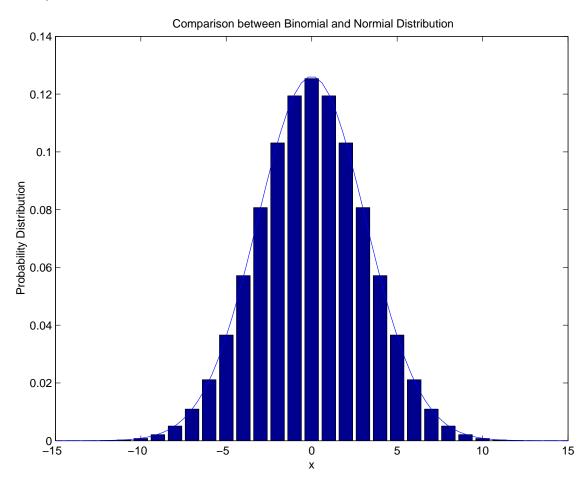
As  $n \to \infty$ ,



What is this **Theorem** called?

### **Binomial converges to Gaussian Distribution**

As  $n \to \infty$ ,



#### **Central Limit Theorem**

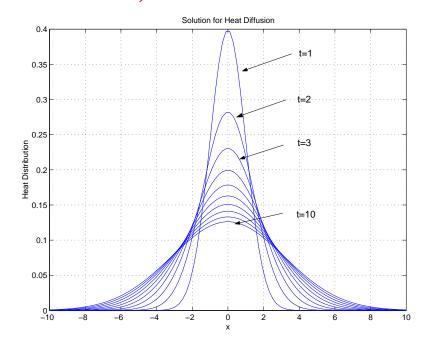
#### **Gaussian Distribution and Heat Diffusion**

**Heat Equation** – describes the **diffusion of heat**:

$$\frac{\partial u}{\partial t} = \frac{1}{2} \frac{\partial^2 u}{\partial x^2}; \quad u(x,0) = \delta(x)$$

The solution is given by:  $u(x,t) = \frac{1}{\sqrt{2\pi t}}e^{-\frac{x^2}{2t}}$ 

#### — Gaussian Distribution, mean zero and variance $\sqrt{t}$

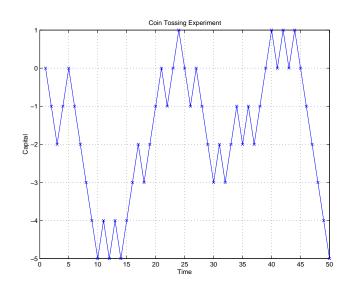


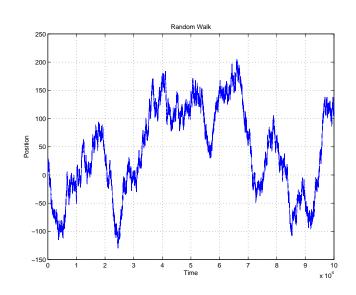
#### **Random Walk and Brownian Motion**

Let the time step  $\triangle t$  and spatial step  $\triangle x$  converge to zero in such a way that

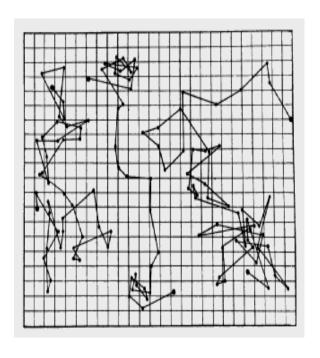
$$\frac{(\triangle x)^2}{\triangle t} \longrightarrow \mathbf{Constant}$$

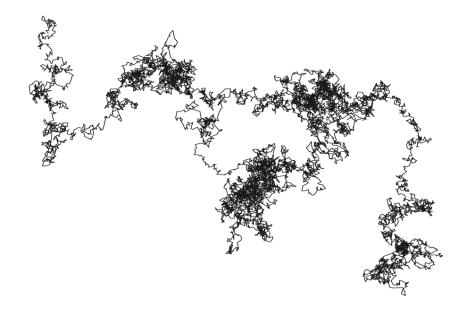
then Random Walk can be described by Brownian Motion.





### Random Walk and Brownian Motion – 2





#### **Brownian Motion – Some Historical Notes**

**Robert Brown** observed the random motion of **pollens in water**.

A

BRIEF ACCOUNT

OF

#### MICROSCOPICAL OBSERVATIONS

Made in the Months of June, July, and August, 1827,

ON THE PARTICLES CONTAINED IN THE POLLEN OF PLANTS;

AND

ON THE GENERAL EXISTENCE OF ACTIVE
MOLECULES

IN ORGANIC AND INORGANIC BODIES.

#### **Brownian Motion – Some Historical Notes – 2**

Albert Einstein made use of the concept of Brownian motion to estimate the size of solute molecules in a solvent.

### INVESTIGATIONS ON THE THEORY OF, THE BROWNIAN MOVEMENT

BY

ALBERT EINSTEIN, Ph.D.

one of the **five** fundamental papers Einstein wrote in 1905:

Einstein's Miraculous Year: Five Papers that Changed the Face of Physics.

Princeton University Press, 2005, John Stachel (ed.)

#### **Brownian Motion – Some Historical Notes – 3**

• The 1926 Nobel Prize in physics was received by **J. Perrin** for his precise determination of the **Avogadro's number**. He compared the experimentally measured diffusivity of spherical granules in water with the **Stokes-Einstein** formula for the **diffusion coefficient**:

$$D = \frac{k_B T}{6\pi \eta R}$$
, and  $D = \lim_{t \to \infty} \frac{\langle X(t)^2 \rangle}{2t}$ 

• Other contributors to the understanding of Brownian Motion: Smoluchowski; Langevin; Ornstein-Ohlenback; Wiener; Levy; ....

# Gambler Ruin Problem

Given initial capital C, between 0 and A, you keep on playing until your capital becomes 0 or A.

If  $p = \frac{1}{2}$  (i.e. the game is fair), then

**Prob(Win)** = 
$$\frac{C}{A}$$
, **Prob(Lose)** =  $1 - \frac{C}{A}$ 

The **expected duration** of the game, either lose or win is:

$$C(A-C)$$

If  $p \neq \frac{1}{2}$ , the above formulas become  $(z = \frac{q}{p})$ 

$$\mathbf{Prob}(\mathbf{Win}) = \frac{z^C - 1}{z^A - 1}, \ \ \mathbf{Prob}(\mathbf{Lose}) = \frac{z^A - z^C}{z^A - 1}$$

Expected duration 
$$= \left(\frac{C}{q-p}\right) - \left(\frac{A}{q-p}\right) \left(\frac{1-z^C}{1-z^A}\right)$$

## Winning by Losing Strategies

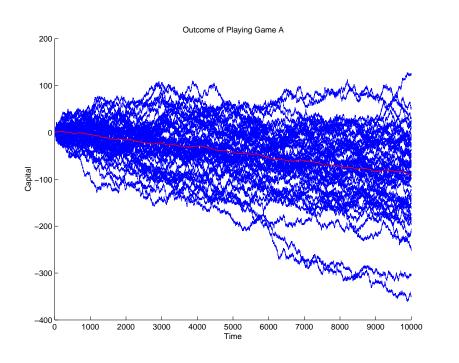
Parrondo's Paradox. G. P. Harmer, D. Abbott, *Nature*, 1999 Now you can choose two different games to play:

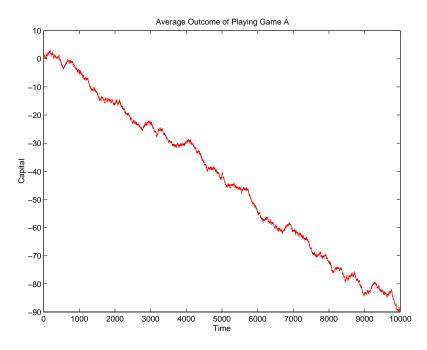
• Game A. One slightly biased coin is used:

**Prob(Head)** = 
$$0.495$$

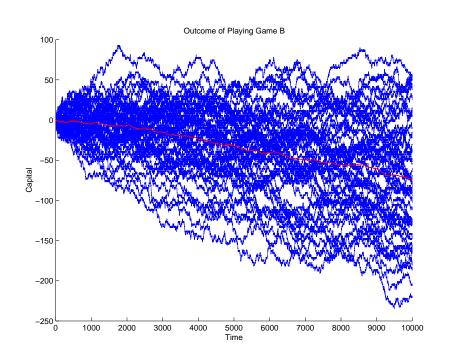
- Game B. Two different coins are used, depending on your current sum (capital).
  - If your current sum is divisible by three i.e. 0, 3, 6, 9..., you toss the coin with Prob(Head)) = 0.095;
  - 2. otherwise, you toss the coin with Prob(Head) = 0.745.

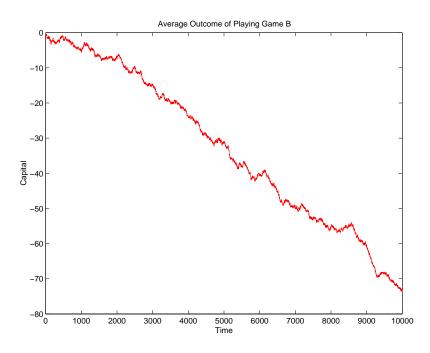
# **Playing Game A Only**





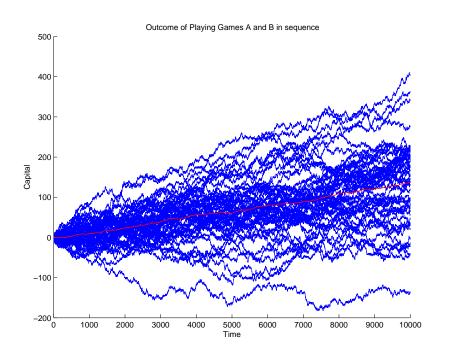
# Playing Game B only

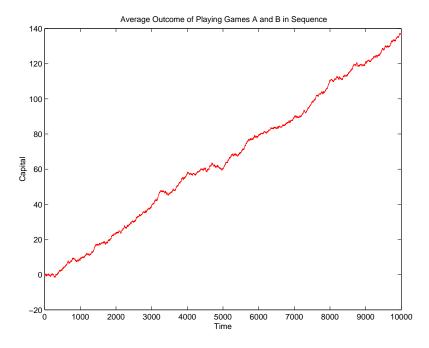




# Playing Games of A and B in sequence:

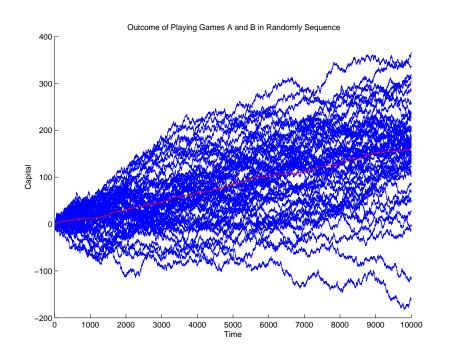
### AABBAABBAABB....

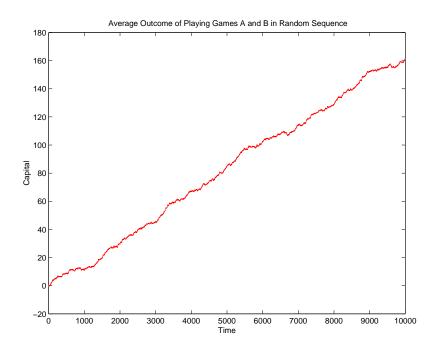




# Playing Games A and B at Random:

#### AABABAABBBBBBBB...



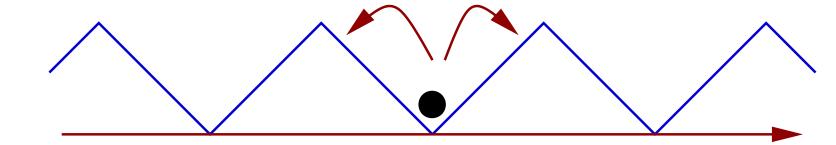


#### Random Walk in Periodic Environment

Homogeneous Environment.
 (No global drift)

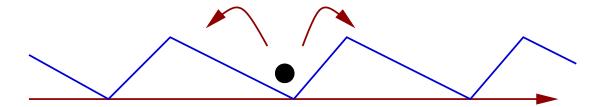


• Inhomogeneous (Symmetric) Environment. (No global drift)

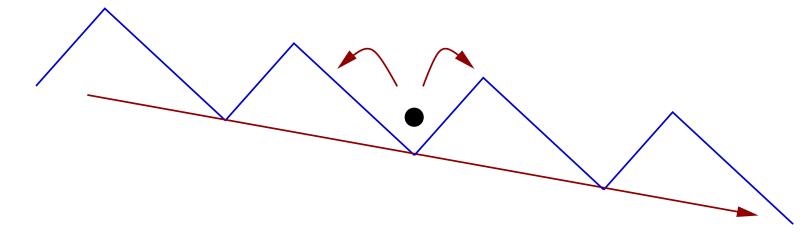


#### Random Walk in Periodic Environment – 2

• Inhomogeneous (Asymmetric, Unbiased) Environment. (Global drift?)

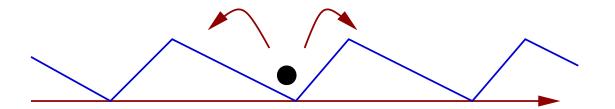


• Inhomogeneous (Biased) Environment. (Global drift?)

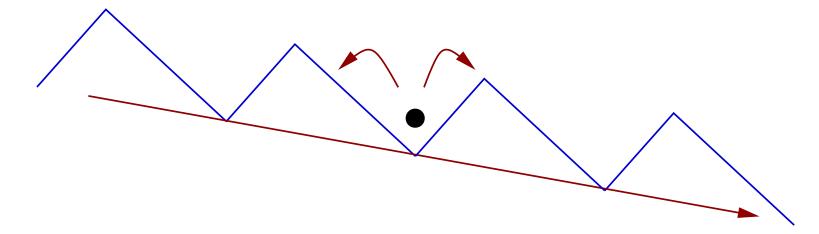


#### Random Walk in Periodic Environment – 2

• Inhomogeneous (Asymmetric, Unbiased) Environment. (Still no global drift)



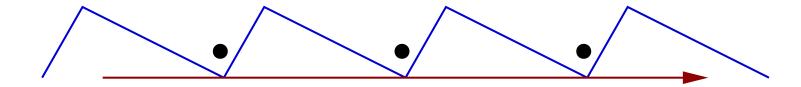
• Inhomogeneous (Biased) Environment. (Global drift)



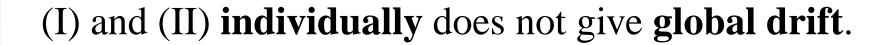
# **Extraction of useful work**

from random noise and un-biased but non-equilibrium fluctuations

• (I) Potential U(x).



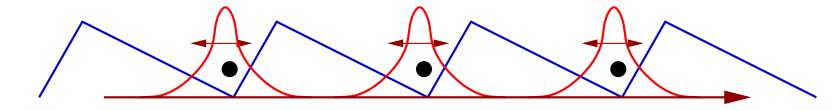
• (II) Potential  $\equiv 0$ .



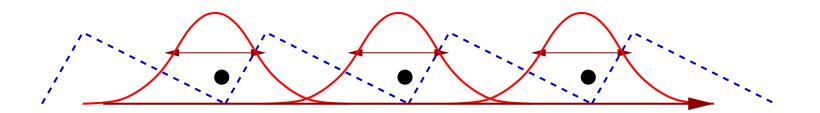
# Extraction of useful work – 2

now alternate (I) and (II) with certain frequency.

• (I) Potential U(x) is ON.

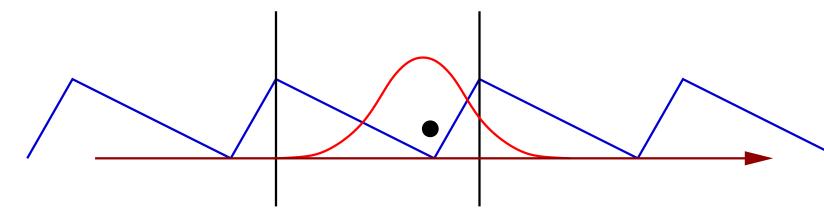


• (II) Potential U(x) is OFF.

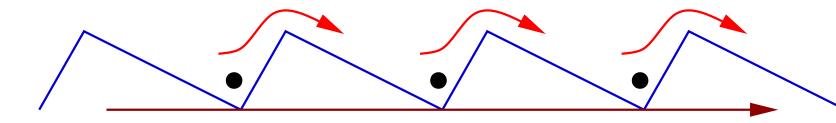


# Extraction of useful work – 3

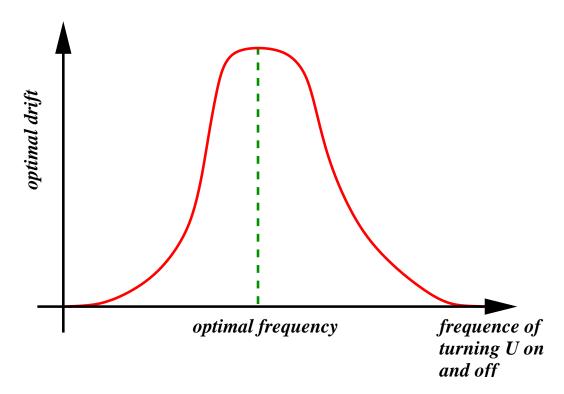
• (I) Potential U(x) is ON again.



• So effectively, there is a global drift.



## **Optimal Frequency – Stochastic Resonance**

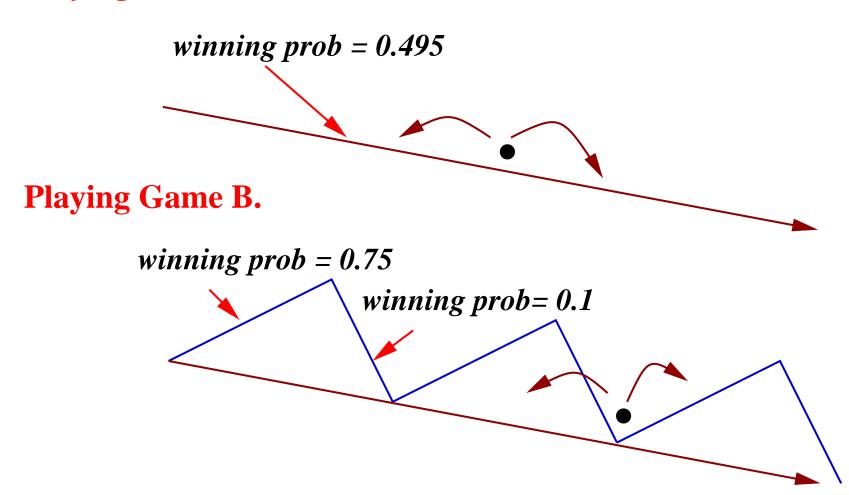


## **Key ingredients:**

- Spatially asymmetric environment;
- Non-equilibrium fluctuations;
- Noise!

# Back to Parrondo's Paradox

Playing Game A.

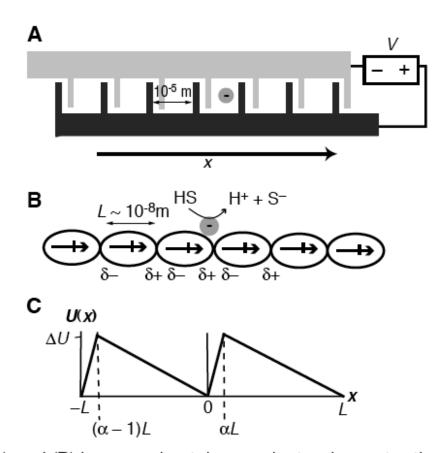


So effectively, there is a winning tendency.

### **Applications of Stochastic Resonance**

#### Astumian, Science, Vol 276, 1997

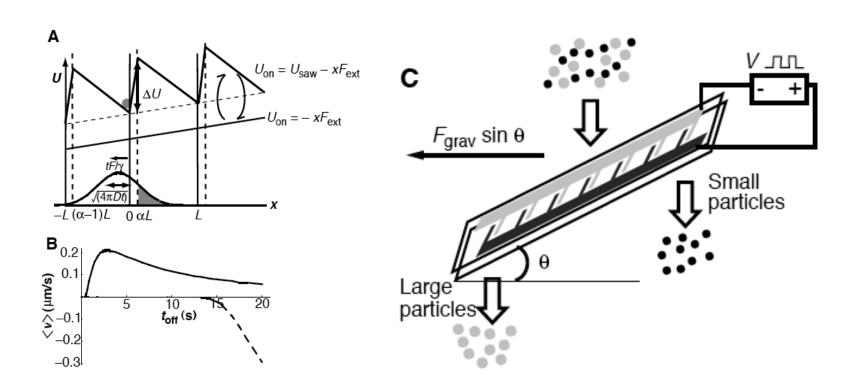
Fig. 1. Two specific models by which an anisotropic periodic potential can arise. (A) When a voltage difference V is applied to interdigitated electrodes deposited on a glass slide with anisotropically positioned "teeth," the resulting potential is spatially periodic but anisotropic. With photolithography it is possible to achieve a spatial period L for such a structure as small as 10<sup>-5</sup> m or even somewhat less. (B) A linear array of dipoles aligned head to tail on which a charged Brownian particle (possibly a protein) moves. The individual dipoles could be macromolecular monomers that aggregate to form an extended linear polymer. The length of the individual monomer is  $L \sim 10^{-8}$  m, a reasonable value for many aggregating proteins. If the particle catalyzes the reaction  $HS \rightarrow H^+ + S^-$ , the charge on the particle, and hence its electrostatic potential energy of interaction with the dipole array U(x, t), fluctuates depending on its



chemical state. (**C**) The potential U(x) for both (A) and (B) is approximately an anisotropic sawtooth function  $U_{\text{saw}}$ , drawn for simplicity as a piece-wise linear function. The amplitude is  $\Delta U$ , and the wells (potential minima) are spaced periodically at positions iL. The anisotropy is parameterized by  $\alpha$ . The amplitude  $\Delta U$  of the sawtooth potential can be modulated in (A) by using an external switching device to control the applied voltage.

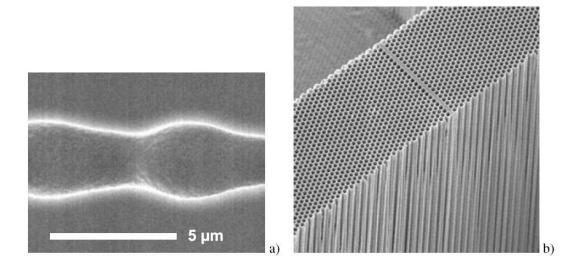
### **Applications of Stochastic Resonance –2**

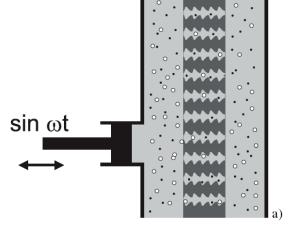
Astumian, Science, Vol 276, 1997

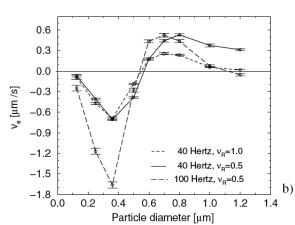


### **Applications of Stochastic Resonance –3**

Hanggi, et. al., Ann. Phys., Vol 14, 2005





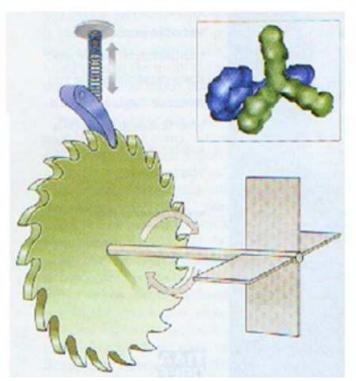


### **Applications of Stochastic Resonance?**

### Taming Maxwell's Demon?

Scientific American, Feb 1999 Feynman's Idea and the Brownian Motor

Moving molecules are supposed to strike the paddles. The prawl should allow motion in one direction only.



Feynman's Lecture Notes in Physics

# THANK YOU