

Lecture # 1:

# Introduction to Statistical Mechanics

First:

① Introduction, my background and current position

② Survey

③ Quick, stand & introduce selves to each other

④ Go through syllabus

What is statistical mechanics?

(Statistical physics, statistical thermo...)

In chemistry we are interested in atoms & molecules:

how molecules interact with one another

We know properties of atoms & small molecules in isolation can be computed using QM

Most chemistry experiments involve large collections of molecules,  $\sim 10^{23}$ , so we cannot compute anything about this

directly using QM or even  
Classical Mechanics (Newton)

However! we know many  
properties of systems can be  
measured that have nothing to  
do with the precise coordinates  
of all the  $10^{23}$  molecules in a box  
(eg. phase transition temperature,  
heat capacity)

Hence we might surmise these  
properties arise when averaging  
some quantity over all the possible  
positions of every molecule in the system  
(lets assume no reactions for now)

In this class:

look@ how measurable quantities arise  
for systems of molecules  
connect classical mechanics with

① thermodynamic quantities (e.g.

Entropy, free-energies, heat capacities etc)  
→ emerge from avg interactions

② look at non-thermodynamic properties  
such as spectra, rates of going  
between states

③ learn about how computer simulations  
can help generate solutions for  
problems that cannot be solved  
exactly

### Real examples

① What is the structure of a liquid,  
and how does this connect to how  
it is measured

- ② general principles of how polymers behave in solution, including how proteins fold
- ③ how do things melt, freeze self assemble, how does this depend on dimension? (eg confinement)
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Crucial to understand statistical quantities used in this class,

Real example, diffusion:

later we may cover diffusion in 3D, particle w/ brownian motion,

Einstein 1905

Consider the simpler case of something trapped in one dimension



Moves distance "a" with prob  $p$  to left  
or right, lets call  $p = 1/2$

How far does it get in  $T$  steps on avg?

This is the same as flipping a coin  $N$  times

particular time seq might be:

$$\text{moves} = \{L, R, R, R, L, \dots\} = \{m_i\}$$

$$\text{trajectory, seq of positions: } \{x_0, x_1, x_2, \dots\} \\ = \{x_i\}$$

time avg:

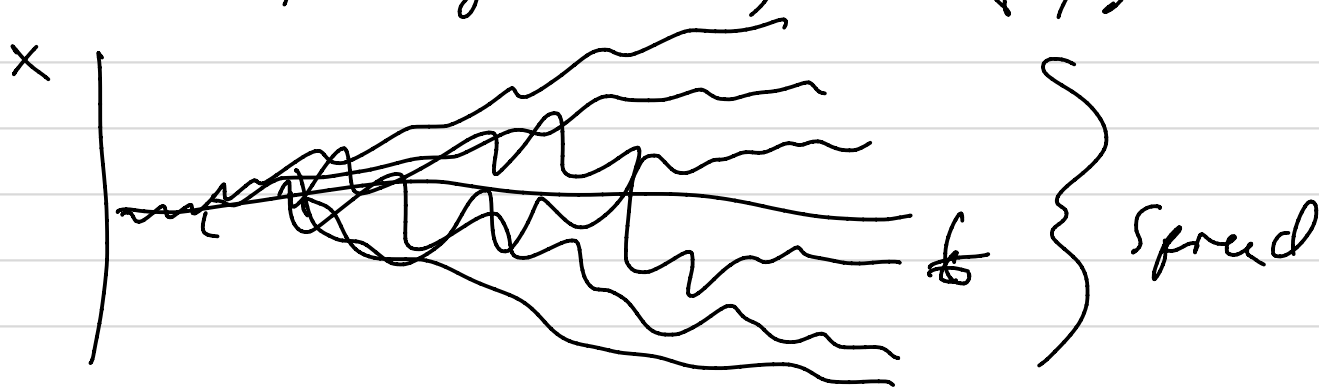
$$\langle A \rangle = \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{i=1}^T A(x_i)$$

$$\text{displacement } d_i = \sum_{j=1}^i m_j = aN_+^i - aN_-^i$$

$$\langle d_T \rangle = \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{i=1}^T aN_+^i - aN_-^i \sim [ap - a(1-p)]T \rightarrow \infty \\ \approx a[2p - 1]T \\ = 0 \text{ if } p = 0.5$$

order didn't matter

however, if you actually do expt, you will find



Measure this by RMS  $d$ ,  $\langle d^2 \rangle$

this is an avg over many trials

for most problems in stat mech, we will  
imagine many copies of the system  
w/ diff init conditions / random seeds

then we perform an "ensemble" avg

$$\langle A \rangle_{\text{ensemble}} = \sum_n P_n A_n \quad \star$$

states

for this problem & others, we expect

$$\langle A \rangle_{\text{time}} = \langle A \rangle_{\text{ensemble}}$$

if this is true for any  $A$ , it is



called an "ergodic" system

Usually, cannot show a system is ergodic  
but we believe it to be true for  
most systems

$$d_T = \sum_{i=1}^T a m_i \sim a N_+ - a N_-$$

$$P_{N_+} = \binom{T}{N_+} p^{N_+} (1-p)^{T-N_+} \propto \text{num sequences with } N_+$$

$$\langle N_+ \rangle \rightarrow T p = T/2, \quad \langle d_T \rangle = a(T/2) - a(T/2) = 0$$

$$\begin{aligned} \langle d_T^2 \rangle &= a^2 \langle (N_+ - N_-)^2 \rangle \\ &= a^2 \langle (2N_+ - T)^2 \rangle = a^2 \langle (4N_+^2 - 4N_+T + T^2) \rangle \end{aligned}$$

$$= a^2 \langle (4N_+^2 - 4N_+T + T^2) \rangle$$

$$\text{Var } N_+ = T p (1-p) = \langle N_+^2 \rangle - \langle N_+ \rangle^2 = \langle N_+^2 \rangle - T^2 p^2$$

$$\Rightarrow \langle N_+^2 \rangle = T p (1-p) + T^2 p^2 \propto T^2$$

$$\begin{aligned} &= a^2 (4(T p (1-p) + T^2 p^2) - 4T^2 p + T^2) \\ &\quad + 4T^2 p (1-p) + T^2 \end{aligned}$$

$$\langle d^2 \rangle \propto T^2 \Rightarrow \sqrt{\langle d^2 \rangle} \propto T$$

This is an example of a standard deviation, def<sup>n</sup>

$$\sigma^2 = \text{Var}(\underline{X}) \equiv \frac{1}{N} \sum_{i=1}^N (x_i - \mu)^2$$

where  $\underline{X} = \{x_1, x_2, \dots, x_N\} = \{x_i\}$

$$\text{and } \mu = \frac{1}{N} \sum_{i=1}^N x_i$$

Important:

$$\frac{1}{N} \sum_{i=1}^N (x_i - \mu)^2 = \frac{1}{N} \sum (x_i^2 - 2x_i\mu + \mu^2)$$

$$= \underbrace{\frac{1}{N} \sum x_i^2}_{\langle x^2 \rangle} - 2\mu \underbrace{\frac{\sum x_i}{N}}_{\mu} + \frac{1}{N} \underbrace{\sum \mu^2}_{N\mu^2}$$

$$= \langle x^2 \rangle - \mu^2 = \langle x^2 \rangle - \langle x \rangle^2$$

$$\textcircled{1} \quad \boxed{\text{Var}(x) = \langle x^2 \rangle - \langle x \rangle^2}$$

$$\textcircled{2} \quad \text{Var}(x) \geq 0 \Rightarrow \langle x^2 \rangle \geq \langle x \rangle^2 \quad *$$

stopped here

Measurements  $X_i$  are assumed to come from an underlying probability distribution



Properties:

① likelihood  $X \in (a, b) = \int_a^b P(x) dx$

② normalized,  $\int_{-\infty}^{\infty} P(x) dx = 1$   
 $-\infty \leftarrow$  or  $\rightarrow$  or  $\infty$  def<sup>n</sup>

Avg:  $\langle A \rangle = \int A(x) P(x) dx$

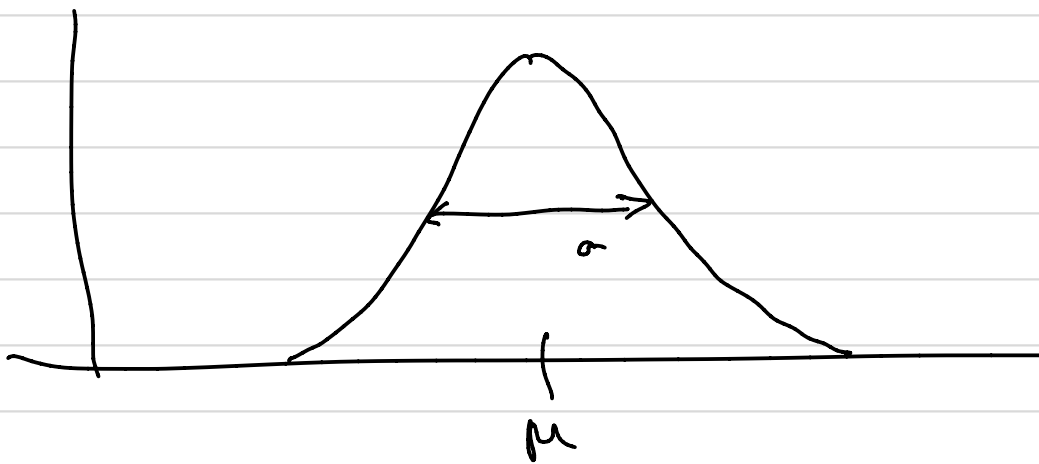
Mean:  $\mu = \langle x \rangle = \int x P(x) dx$

Variance:  $\sigma^2 = \langle x^2 \rangle - \langle x \rangle^2 = \int x^2 P(x) dx - \mu^2$   
 $= \int (x - \mu)^2 P(x) dx$

Very important distribution,

$$P(x) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(x-\mu)^2}{2\sigma^2}} \sim \mathcal{N}(\mu, \sigma^2)$$

Normal distribution



(HW, prove normalization const)

Central limit theorem!

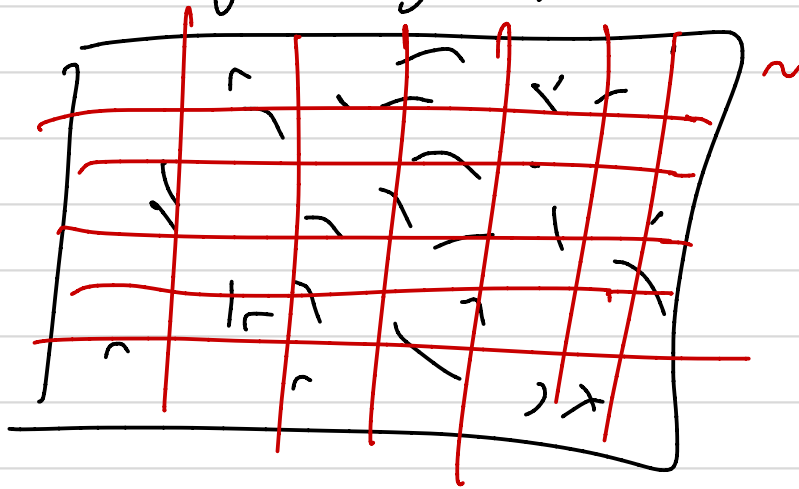
Suppose  $X_i$  from any  $P(x)$

$$\text{Sample mean } \mu_N = \frac{1}{N} \sum_{i=1}^N X_i$$

$$P(\mu_N - \mu) \xrightarrow{N \rightarrow \infty} \mathcal{N}(0, \sigma^2/N)$$

which means avg error on mean  
 $\langle (\mu_N - \mu)^2 \rangle = \sigma^2/N \rightarrow$  std dev of mean  $\propto 1/\sqrt{N}$

In stat mech, we imagine taking our large system



$$N_{\text{boxes}} = V/\epsilon^d$$
$$\propto N_{\text{molecules}}$$

Compute  $A_i$  on any subsystem

$$\text{Then } \sqrt{\langle A - \langle A \rangle \rangle^2} \sim 1/\sqrt{N}$$

Hence for a large system we always measure the avg quantity

(if  $\epsilon$  can be sufficiently small)