

# Statistical mechanics for molecular simulations, (2015) ①

## Lecture 1

1/22/2015.

### Fundamentals of statistical mechanics.

- \* ensemble theory
- \* two postulates of Stat. mech.
- \* microcanonical ensemble
- \* canonical ensemble.
- \* thermodynamic limit.
  
- \* Course description/details.

first lecture!

1. list of attendees.
2. textbook/references
3. open/informal environment.
4. background check.
5. web resources & course details.

<http://quantum.ch.nyu.edu.tw/ycc/lab/winter-short-course-2015>

Molecular simulations have become invaluable tools for ~~most~~ researchers in chemistry, physics, biology, & material science.

This <sup>short</sup> course aims to provide the basic theoretical background that should better prepare you to understand/interpret the results of molecular ~~simulations~~ <sup>timeless</sup>

Of course, we can only present a very brief introduction to the very fundamentals here. Two things I want to discuss in particular  $\Rightarrow$  entropy & Boltzmann distribution.

$\Rightarrow$  but, yes, I want to teach you statistical thermodynamics in a week!!  
\* ensemble theory.

Modern stat. mech. is presented using ensemble theory as its foundation.

Macroscopic systems are too complicated, we can not track all microscopic/molecular motions of all particles in a bulk system  $\Rightarrow$  we can only consider "averaged" quantities.

key  $\Rightarrow$  a macroscopic state <sup>thermodynamic state</sup> ~~can~~ actually is consist of many-many "microstates".

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We define "ensemble" to describe macroscopic states. There are two "equivalent" views:

Ensemble is:

① ~~ensemble~~ (microstate view) the collection of all microstates consistent with the constraints that characterize the macroscopic system.

eg.: two spins:  $\uparrow\uparrow, \downarrow\downarrow, \frac{1}{2}(\uparrow\downarrow + \downarrow\uparrow)$

"full house" in a deck of cards ...

② (replica view) a collection of independent systems ( $\sim 10^{23}$ ) that each can be in a different state satisfying the constraints.

eg.: an ensemble of proteins in water. in an NMR tube  
the ensemble of boys/girls in the classroom ~

Note that these two views are the same.

★ Ensemble is defined by "constraints" ~

timeless

we can calculate macroscopic observables based on "statistics" !!

\* Statistical principle

ensemble postulate of Gibbs

Now we "assume" that in equilibrium, an ensemble exhibits a definite distribution over microstates, so a thermodynamic variable.

$$X = \langle X \rangle = \sum P_i \cdot X_i$$

ensemble average.      observed value when system is in the i-th microstate.

prob. of the occurrence of i-th microstate over all microstates

So, the key is to figure out  $P_i$  for different ensembles.

How do we determine  $P_i$  ?

\* The principle of equal "a priori" probabilities. one can't be proven, "you can see that it is true just by lying on your couch."

For an isolated system in thermal equilibrium, all microstates with the same energy are equally populated.

\* actually we neglect the "ergodic hypothesis" here: ensemble average = time average. timeless

So, let's think about ensemble.

(f)

\* microcanonical ensemble:  $(E, V, n)$  fixed.

Nature for  
Isolated  
systems, because  
the underlying  
"mechanics"  
is energy  
conserving.

Now we are ready to consider a  
particular ensemble. Let's start from  
the simplest case, with  $(E, V, n)$  fixed.

This is called a microcanonical ensemble.

$(E, V, n)$  fixed  $\Rightarrow$  microcanonical.

It is clear that all states are  
equally populated, so

$$\langle X \rangle = \frac{1}{\Omega} \sum_{\nu} X_{\nu}$$

$\Omega$ : number of states in the microcanonical  
ensemble.

$\Omega$  is the key microscopic quantity of the  
ensemble !!  $\Omega = \Omega(E, V, n)$ .

timeless

⑥

To determine the thermodynamic properties of this ensemble, we must calculate some thermodynamic function, recognize.

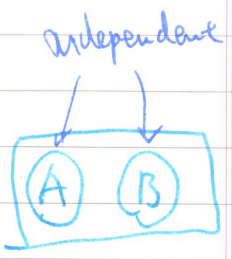
$(E, V, n)$  fixed  $\longrightarrow$  entropy  $S$

So  $S$  is the key thermodynamic function that describes the microscopic ensemble.

How can we determine  $S$ ?

but this is the only reasonable one.  $\rightarrow$  ① We "postulate" that  $S$  is a function of  $\Omega$ .  
So, for a system  $A$ .

$$S_A(E, V, n) = f(\Omega_A(E, V, n)).$$



② Entropy is additive, for independent systems  $A$  &  $B$

$$S_{A+B} = S_A + S_B$$

note that the # of microstates for independent systems

$$\Omega_{A+B} = \Omega_A \times \Omega_B$$

$\swarrow$  multiplication!!

It is impossible to really understand "entropy" without the microscopic formula. (7)  
; we need to find  $f(\cdot)$  such that

$$f(S_A \times S_B) = f(S_A) + f(S_B)$$

clearly, this function is  $\ln(\cdot)$ .

The only physically reasonable ~~definition~~ <sup>relation</sup>  
~~relation~~ between  $S$  &  $\Omega$  is then

Boltzmann's  
Tomb:

$$S_A = k_B \ln \Omega$$

$$S = k \log W$$

This is Boltzmann's microscopic definition  
of entropy.

We finally  
answer

"What is  
entropy?"

Entropy measures the number of <sup>accessible</sup> microstates  
in an microcanonical ensemble!!

\* third law

Now the third law is easy to see,  
because  $\Omega \geq 1$

$\Rightarrow$  at  $T=0$ , system only occupy the ground  
state,  $\Omega=1 \Rightarrow S=0$ !!

timeless

\* connection to thermodynamics

Now it is easy to calculate thermodynamic variables. Recall

$$dE = Tds - pdV + \mu dn$$

$$ds = \frac{1}{T} dE + \frac{p}{T} dV - \frac{\mu}{T} dn$$

It is straight forward to derive.

$$\boxed{\frac{1}{k_B T} = \left( \frac{\partial \ln \Omega}{\partial E} \right)_{V, n}}$$

← highlight this, we will use this next time.

$$\frac{p}{k_B T} = \left( \frac{\partial \ln \Omega}{\partial V} \right)_{E, n}$$

$$\frac{\mu}{k_B T} = - \left( \frac{\partial \ln \Omega}{\partial N} \right)_{E, V}$$

all thermodynamic properties can be

calculated once  $\Omega$  is determined !!

All these can be formally derived.

The microcanonical ensemble does not have temperature. It is nature in simulation, but it is not very useful. timeless



We must release some of the constraints & study more general ensemble. (2)

\* Canonical ensemble,

So we consider an ensemble with

fixed  $(T, V, n) \Rightarrow$  canonical ensemble.

Again  $\langle X \rangle = \sum_{\nu} P_{\nu} X_{\nu}$ , the key is

to figure out  $P_{\nu}$  !! A trick is

to construct the canonical ensemble

using composite microcanonical ensemble.

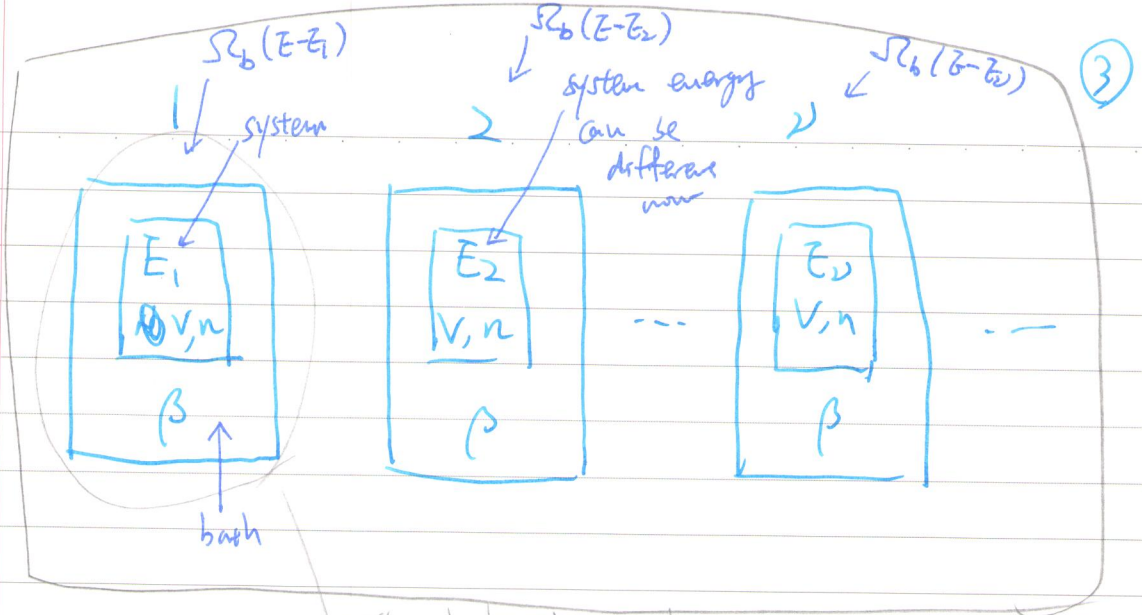
We picture an <sup>ensemble of</sup> isolated system + bath that has a fixed total energy  $E = E_B + E_S$ .

$E_B$ : bath energy

$E_S$ : system energy

Notice that naturally  $E_B \gg E_S$ , because bath is large.

timeless



system+bath has the same energy  
all microstates isolated with fixed  $(E, V, n) \rightarrow$  microcanonical

Note that all these system+bath states ~~are~~ form a microcanonical ensemble, while all the systems form a canonical ensemble.

Now, if ~~we~~ the system is in one specific state  $\rightarrow$  with energy  $E_i$ .

many microstates in the system+bath microcanonical ensemble have system energy  $E_i$ , because the bath can exist in many different states!!

④

The number of states with  $E_B = E_S$  is determined by the # of configurations in the bath, i.e. number of bath states satisfying  $E_B + E_S = E$ .

Mathematically:

$$\sum_{\text{STB}} (\text{system energy} = E_S) = \sum_{\substack{\# \text{ of bath states} \\ E_B = E - E_S}} \Omega_b(E_B)$$

$$= \sum_{\substack{\# \text{ of states of} \\ \text{the total STB}}} \Omega_b(E - E_S)$$

Now, within such states in the system + bath microcanonical ensemble  $\rightarrow$  they have the same energy, so the probability is proportional to the # of states.

$$P(E_S) \equiv P_S = \frac{\Omega_b(E - E_S)}{\sum_S \Omega_b(E - E_S)} \propto \Omega_b(E - E_S)$$

Let's now estimate  $\Omega_b(E - E_S)$ .

timeless

Notice that

$$\Omega_b(E - \epsilon_j) = \exp\{\ln \Omega_b(E - \epsilon_j)\}$$

Since  $E \gg \epsilon_j$ , we can expand  $\ln \Omega_b(E - \epsilon_j)$  as a Taylor series of  $\epsilon_j$ :  
 $\Omega$  is a large number so only expansion on  $\ln \Omega$  makes sense.

$$\ln \Omega(E - \epsilon_j) = \ln \Omega(E) - \epsilon_j \cdot \left(\frac{d \ln \Omega}{dE}\right)_{V,n} + \dots$$

Now recall that  $\left(\frac{d \ln \Omega}{dE}\right)_{V,n} = \frac{1}{k_B T} = \beta$

Therefore  
 $\Omega(E - \epsilon_j) \approx \Omega(E) \cdot e^{-\beta \epsilon_j}$        $P_j \propto e^{-\beta \epsilon_j}$

that is, the number of accessible states grows exponentially as a function of energy!!

This is the canonical Boltzmann distribution law !!

exp. for exp. growth of # of accessible states.

$$P_j = \frac{1}{Q} e^{-\beta \epsilon_j}$$

$$Q = Q(\beta, V, n) = \sum_j e^{-\beta \epsilon_j}$$
 is the

normalization factor, and is called the canonical partition function.

timeless

⑥

Note that we pay special attention to the partition function because it is the generating function of various thermodynamic variables.

For example:

$$Q = \sum e^{-\beta E_i}$$

$$\therefore \left(\frac{\partial Q}{\partial \beta}\right)_{V,n} = \sum E_i \cdot e^{-\beta E_i}$$

$$-\left(\frac{\partial \ln Q}{\partial \beta}\right)_{V,n} = -\frac{1}{Q} \cdot \left(\frac{\partial Q}{\partial \beta}\right)_{V,n}$$

$$dA = -SdT - pdV + \mu dn$$

$$\left(\frac{\partial A}{\partial T}\right)_{V,n} = -S$$

$$= + \frac{1}{Q} \cdot \sum E_i \cdot e^{-\beta E_i}$$

internal energy!!

$$= \sum p_i \cdot E_i = \langle E \rangle = U$$

also

$$A = U - TS$$

at fixed T

$$A = U + T \left(\frac{\partial A}{\partial T}\right)_{V,n}$$

now realize

$$U = -T^2 \left[ \frac{\partial (A/T)}{\partial T} \right]_{V,n}$$

$$= \left(\frac{\partial (A/T)}{\partial (1/T)}\right)_{V,n}$$

$$U = \left(\frac{\partial (A/T)}{\partial (1/T)}\right)_{V,n}$$

from thermo.

$$\Rightarrow \frac{A}{T} = -k_B \ln Q \Rightarrow A = -k_B T \ln Q$$

timeless

\* Connection to thermodynamics.

So for the canonical ensemble, we

calculate the Helmholtz free energy:  
as expected!! fixed  $(T, V, N)$

$$A = -k_B T \cdot \ln Q.$$

and then.

$$S = -\left(\frac{\partial A}{\partial T}\right)_{V, N} = k_B \ln Q + k_B T \cdot \left(\frac{\partial \ln Q}{\partial T}\right)_{V, N}$$

$$p = k_B T \cdot \left(\frac{\partial \ln Q}{\partial V}\right)_{T, N}$$

$$\mu = -k_B T \cdot \left(\frac{\partial \ln Q}{\partial n}\right)_{T, V}.$$

$$E = -\left(\frac{\partial \ln Q}{\partial \beta}\right)_{V, N} = k_B T^2 \cdot \left(\frac{\partial \ln Q}{\partial T}\right)_{V, N}.$$

practical prescription  
of stat. mech.  
calculations.

} all thermodynamic properties can be  
calculated from  $Q$ .

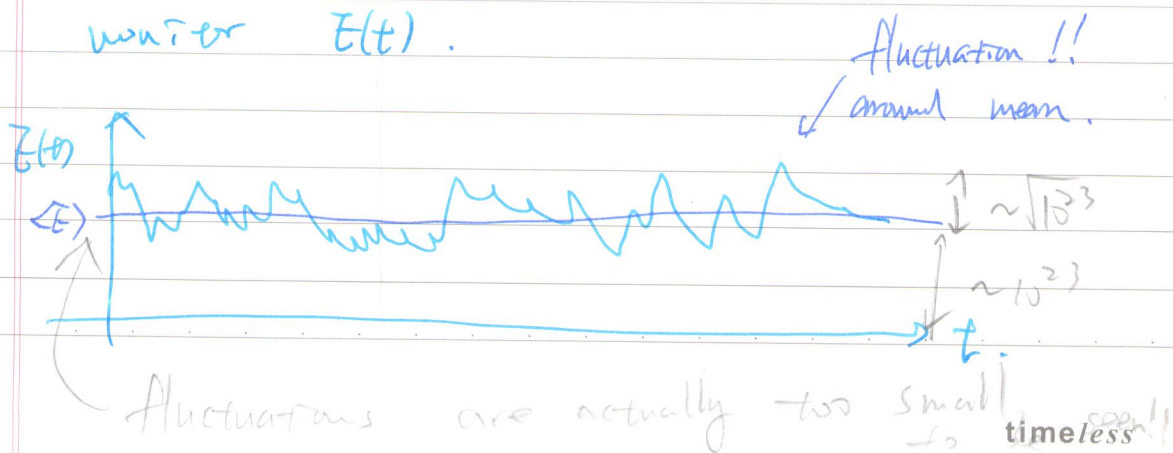
⇒ basic principles of statistical thermodynamics  
are all here !!

# \* Thermodynamic limit.

As a final note, a departing gift,  
I want to come back to a statement  
that I made at the first lecture.

Thermodynamics requires "macroscopic" bulk  
systems. Why?

Consider the ~~thermo~~ canonical ensemble,  
the system can be in any microstate  
at any time, and  $\mu$  is actually  
time dependent!! if one can  
monitor  $E(t)$ .



The essential question is that why we do not observe the fluctuations of the energy (or any other extensive macroscopic observable) as a function of time?

Let's calculate the amplitude of fluctuations; Notice that

$$\begin{aligned} \langle E^2 \rangle &= \int \frac{1}{\Omega} E_i^2 \\ &= \int \frac{e^{-\beta E_i}}{\Omega} E_i^2 = \frac{1}{\Omega} \left( \frac{\partial^2 \Omega}{\partial \beta^2} \right)_{V, n} \\ &= \left( \frac{\partial^2 \ln \Omega}{\partial \beta^2} \right)_{V, n} + \langle E \rangle^2 \end{aligned}$$

$\beta = \frac{1}{k_B T}$   $C_V$

$$\left( \frac{\partial U}{\partial p} \right) = \left( \frac{\partial U}{\partial T} \right) \left( \frac{\partial T}{\partial p} \right)$$

$$\left( \frac{\partial p}{\partial T} \right) = -\frac{1}{T^2} \left( \frac{\partial U}{\partial T} \right)$$

$$\therefore \left( \frac{\partial T}{\partial p} \right) = -k_B \cdot T^2$$

Therefore

$$\begin{aligned} \langle \delta E^2 \rangle &= \langle E^2 \rangle - \langle E \rangle^2 = \left( \frac{\partial^2 \ln \Omega}{\partial \beta^2} \right)_{V, n} \\ &= - \left( \frac{\partial^2 (pA)}{\partial \beta^2} \right)_{V, n} = - \frac{\partial}{\partial \beta} \left( \frac{\partial (pA)}{\partial \beta} \right)_{V, n} = - \left( \frac{\partial U}{\partial \beta} \right)_{V, n} \\ &= k_B \cdot T^2 \cdot C_V. \end{aligned}$$

timeless



clearly, the amplitude of fluctuations

$$\sqrt{\langle \delta E^2 \rangle} = \sqrt{k_B \cdot C_V \cdot T} \sim \sqrt{N}$$

$\uparrow$  extensive     $\uparrow$  intensive  
 const.

The energy fluctuation depends on temperature

and the heat capacity of the

system. This is reasonable considering

the random heat transfer is

what actually leads to the fluctuations.

What is physically meaningful is

that when one looks not

the "relative" amplitude of

fluctuations.

E is extensive !!

Recall

size of (1)  
the system  
↓

$\langle E \rangle$  is extensive, so  $\langle E \rangle \sim N$

$C_V$  is extensive, so  $C_V \sim N$

Therefore  $\sqrt{\langle \delta E^2 \rangle} \sim \sqrt{N}$ .

Therefore, the relative amplitude of fluctuations  
to the mean energy is

$$\frac{\sqrt{\langle \delta E^2 \rangle}}{\langle E \rangle} \sim \frac{\sqrt{N}}{N} = \frac{1}{\sqrt{N}}$$

given that  $N \approx 10^{23}$ ,

what does this mean?

Ans: The fluctuations are so small  
that they can't be detected!!

(13)

Now one can imagine that to have a macroscopic system is important to "suppress" the fluctuations.

otherwise, stationary thermodynamic thermal equilibrium can not be ~~est~~ established, the <sup>microscopic</sup> system is always in fluctuations!!

⇒ Thermodynamics requires that  $N \gg 1$ .

⇒ Thermodynamic limit!!

⇒ This ends our discussion on thermodynamics, and I hope this course is useful for you!!