

**Physics 114   Statistical Mechanics   Spring 2018**  
**Seminar 6**

**Overview:**

This week, we'll continue to work with the *Canonical ensemble*. We'll see the simple relationship between  $Z(T, V, N)$  and the Helmholtz free energy,  $F(T, V, N)$ . We'll practice calculating other thermodynamic variables, both ones that are easy to measure and control (like  $P$ ), easy to measure but not control (like  $C_V$ ) and difficult to control (like  $E$  and  $S$ ) from  $Z(T, V, N)$ . We'll do problems that bridge the gap between micro canonical and canonical statistics - showing that for thermodynamically large systems, these provide two roads to the same destination. Finally, via a presentation, we will study how one simulates a system of interacting particles using *Monte Carlo*.

**Required Reading:**

G&T Sections

- Section 4.7-4.11
  
- Sections 4.13

B&B sections

- Section 4.7
- Ch. 20
- Ch. 21

**Recommended Reading:**

- Every book on our Cornell library reserve shelf has a section on the Canonical ensembles, with good explanations and examples.
- Vis a vis our discussion last week on erasing bits and entropy:  
<https://arstechnica.com/science/2012/03/information-and-entropy-finally-linked-through-experiment/>

## Concept checklist from Readings:

- **From  $Z$  comes the free energy, and more ...** Last week in B&B problem 14.8 we saw that

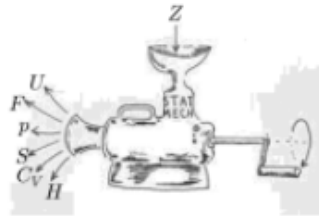
$$S/k = \beta \bar{E} + \ln Z$$

(except that B&B used  $U$ , not  $\bar{E}$  for energy.) This week, this equation reappears; moreover we learn that Helmholtz free energy is the “natural” free energy for the Canonical ensemble:

$$F(T, V, N) = -kT \ln Z(T, V, N) \quad \text{or equivalently} \quad Z = e^{-\beta F}$$

As the logarithm of a “master function”, free energy is also a master function. Either produces all thermodynamic information.

- This sausage machine:



produces, via explicit formulae we already know, all useful functions of state.

Function of state	Statistical mechanical expression
$U$	$-\frac{d \ln Z}{d\beta}$
$F$	$-k_B T \ln Z$
$S = -\left(\frac{\partial F}{\partial T}\right)_V = \frac{U-F}{T}$	$k_B \ln Z + k_B T \left(\frac{\partial \ln Z}{\partial T}\right)_V$
$p = -\left(\frac{\partial F}{\partial V}\right)_T$	$k_B T \left(\frac{\partial \ln Z}{\partial V}\right)_T$
$H = U + pV$	$k_B T \left[ T \left(\frac{\partial \ln Z}{\partial T}\right)_V + V \left(\frac{\partial \ln Z}{\partial V}\right)_T \right]$
$G = F + pV = H - TS$	$k_B T \left[ -\ln Z + V \left(\frac{\partial \ln Z}{\partial V}\right)_T \right]$
$C_V = \left(\frac{\partial U}{\partial T}\right)_V$	$k_B T \left[ 2 \left(\frac{\partial \ln Z}{\partial T}\right)_V + T \left(\frac{\partial^2 \ln Z}{\partial T^2}\right)_V \right]$

Table 20.1 Thermodynamic quantities derived from the partition function  $Z$ .

- Analogy:  $\Omega(E, V, N)$  and its logarithm  $S(E, V, N)$  contain all thermodynamic information in the micro canonical ensemble.
- The protocol for the Canonical ensemble is simply described in a box in Ch. 20 of B&B

1. Write down  $Z$
2. Go through standard procedures to obtain functions of state you want from  $Z$

- **Applications of Canonical ensemble to single-particle systems, with easy extension to  $N$  particles ...**

- As mentioned last week, often partition functions for  $N$  particles are simply derived from 1 particle ones. This is possible if the particles don't interact! This explains why many of the examples this week are pitched in terms of finding  $f = -kT \ln Z(T, V, 1)$ ,  $s = -(\partial f / \partial T)_V$ ,  $\bar{e} = -\partial \ln Z(T, V, 1) / \partial \beta$ , ... and so on. These are the free energy, entropy, and expected energy *per particle*. For  $N$  non-interacting particles, you just *multiply by  $N$* .
- Many examples are done this week, which are good “toy” models for realistic systems. Please be sure that for the models listed below, you feel comfortable finding both single-particle and  $N$ -particle quantities like  $\bar{E}$ ,  $S$ ,  $C$ , ...
  - 2-level system
  - $N$ -level system
  - 1d harmonic oscillator
  - Rotating diatomic molecule
  - Chemical reactions: dependence of products on temperature
  - The isothermal atmosphere
  - The spin 1/2 paramagnet
  - The ideal gas
- The specific heat  $C = \partial E / \partial T$  is of particular interest this week. Please be sure you can see a calculation through, beginning with  $Z$  and ending with a “response function” like specific heat.
- We have confidence that the *equipartition theorem* holds for sufficiently high  $T$ , and this gives us a guide to what  $\bar{E}$  and  $C$  should be in the high temperature limit.

- *Magnetic systems* have a couple of observables that we care about in addition to  $\bar{E}$  and  $C$ . These are the magnetization  $m = -(\partial F/\partial B)_T$  and the susceptibility  $\chi \propto \partial m/\partial B$ . (It is the case that  $\chi \propto m/B$  in the limit that  $B \rightarrow 0$ .) We will do more with paramagnets in a later week; for now just appreciate that we can find these things in the Canonical ensemble :-)

- **The Canonical ensemble for ideal gasses ...** Ch. 22 of B&B is all about the ideal gas; a review and extension of what we did last week. In particular it

- reviews finding the density of states  $g(k)$  and  $g(E)$  with particle-in-a-box counting arguments.
- emphasizes the importance of the thermal de Broglie wavelength, now called  $\lambda_{th}$ . The idea of *quantum concentration* was introduced in a problem last week, and is now called  $n_Q = 1/\lambda_{th}^3$ . When particles are much less concentrated than  $n_Q$ , they can be treated classically. An elegant way to write the single particle partition function for the ideal gas is:

$$Z_1 = \frac{V}{n_Q}$$

- extends what we already did, to find free energies like  $F$ ,  $G$  and  $H$  for a Canonical treatment of the ideal gas. Please see Problem 8 ii) for a statement that *all ensembles* are supposed to give the same results for these in the thermodynamic limit!
- calculates the Sackur-Tetrode entropy  $S(T, V, N)$  and goes over the notion of *entropy of mixing* and the *Gibbs paradox*.
- discusses as an example, the heat capacity of the diatomic ideal gas. B&B does quantitatively what we did qualitatively in G&T problem 6.47 last week, when we discussed equipartition for a diatomic molecule that could rotate (and vibrate).

- **The Canonical partition function: its uses and some useful facts ...** (some relevant items from last week's summary)

- One can not only find the expectation value of the energy:  $\bar{E} = -\partial \ln Z/\partial T$  but also the expected size of mean squared fluctuations in the energy:

$$\langle E^2 - \bar{E}^2 \rangle = kT^2 C_V$$

- If we use a label  $\alpha$  to signify a microstate, then

$$Z = \sum_{\alpha} e^{-\beta E_{\alpha}} \quad (1)$$

- If a macrostate whose energy is  $E_J$  has got multiple microstates, we need to count them ... to find the *degeneracy*  $g_J$ . Then we can write:

$$Z = \sum_J g_J E^{-\beta E_J} \quad (2)$$

Please note that Eqs. (1) and (2) are *calculating the same thing in two different ways*.

- Sometimes energy is a continuous variable. Even if discrete, sometimes energy states are so closely spaced that there is a huge number in any interval  $\Delta E$  we could measure. An example is the *semiclassical ideal gas*. In this case, the degeneracy is called the *density of states*  $g(E)$ . This is much like last week when we had probabilities,  $p(x_i)$  for discrete variables  $x_i$ , and probability densities  $p(x)$  for continuous variables. Now,

$$Z = \int g(E) e^{-\beta E} dE$$

- $Z(T, V, N)$  is the partition function for  $N$  particles, but we read a lot about the *single particle partition function*. Why care about one particle? Because  $Z(T, V, 1)$  is often much easier to calculate, and if we have  $N$  distinguishable particles, it is the case that *for noninteracting particles*

$$Z(T, V, N) = Z(T, V, 1)^N \text{ distinguishable particles}$$

- In a related way, if we have three completely different degrees of freedom (like A = rotations, B = translations, and C = vibrations) then partition functions just multiply

$$Z = Z_A Z_B Z_C$$

- What about  $N$  indistinguishable particles?
  - The *right way*: Find out if they are bosons and fermions and do the correct counting arguments
  - The *not-totally-right way*: This works for classical ideal gasses, and is essential to get the entropy of mixing correct:

$$Z(T, V, N) = \frac{1}{N!} Z(T, V, 1)^N \text{ dilute, semiclassical particles}$$

This approach is predicated on the idea that there are so many states, and so few particles ( $N$  is few? Yes,  $N$  is few compared to the number of available quantum states.) that it would be extremely unlikely to find any two particles occupying the same quantum state.

- **Simulation techniques ...**

- In our G&T reading, we learn
  - a tiny bit about *micro canonical simulations*, which will be more relevant when we do magnetic systems (because other things than energy are of interest)
  - *demon thermometer simulations*, which we have used with good results in previous weeks
  - *canonical simulations*, which could be done by solving  $F = ma$  (molecular dynamics) but are easier to do via *Monte Carlo (MC)*. A description of the standard Metropolis algorithm is given, which involves the very useful accept/reject paradigm that will establish thermal equilibrium at temperature  $T$ .

**Warmup Problem:** *Due before seminar, Monday (best) or Tuesday (second best) or by seminar time (I'll take it ;-)*

**1: High T limits of partition functions:** B&B problem 20.1

**Presentation: MC simulation:** *Taking on this presentation presumes that you feel comfortable enough to write a straightforward MC simulation yourself. I think I recall from the warmup for Seminar 1 that all of you could do this. It could be a Matlab .m file, or a Python notebook, or Mathematica ... anything. If you do not feel comfortable with this assignment, talk to me early (like Monday) and we will figure something out?!*

i) Talk us through the standard steps of a Metropolis Monte Carlo simulation, as listed on G&T p. 227.

ii) Construct your own MC simulation and show us some results. Here is a suggested protocol that would simulate an Einstein solid:

1. Decide on a temperature. That is, let  $1/kT = \beta$  and pick a value of  $\beta$ . I suggest a value not too different from  $\beta = 1$ , but you can try a couple of different values, and see what difference it makes.
2. Initialize: Create an array of  $N$  numbers representing the energies of a set of  $N$  particles. Let them each start with 0 energy.
3. Pick a random particle (That is, choose a random integer between 1 and  $N$  to determine your particle of interest.)

4. Trial move: Toss a “coin” (That is, choose another random integer, now either 0 or 1.) If heads, consider adding  $\Delta E = +1$  to the energy of the particle. If tails, think about adding  $\Delta E = -1$  to its energy.
5. Accept or reject the move:
  - Definitely accept the move if it would lower the particle’s energy, but not below zero.
  - Definitely reject the move if it would lower the energy of the particle below 0.
  - Accept the move with probability  $e^{-\beta\Delta E}$  if it would raise the energy. (To do this, you need to generate a real random number between 0 and 1, which G&T call  $r$ .)
6. Go back to step 3 and iterate a lot of times ... you want each of the  $N$  particles to experience many moves.

As the simulation proceeds, measure something interesting. Average energy? A histogram of energies? Other ...?

## Regular problems:

**1: Einstein solid + Magnetic system** (a review of last week’s methods)

G&T Problem 4.38

*Note: My bad ... I really wanted folks to do 4.39 which matches this title. Whichever of these two you did ... it’s all good.*

**2: Harmonic Oscillators** (We did micro canonical as G&T 4.22 last week - now ... canonical!)

G&T Problem 4.28

**3: More Harmonic Oscillators**

G&T Problem 4.50

*Hint: Much of this is done in B&B ... please fill in any gaps in math or logic for yourself.*

**4: Z and more for a 2-particle system:**

G&T Problem 4.52

**5: Hydrogen:**

B&B Problem 20.8

**6: A 2-state system with degeneracy:**

B&B Problem 21.4

Also: Please compare and contrast your result for  $C$ , Eq. (21.46), with with Figure 20.4 part (a), which applies to a slightly different 2-state system.

**7: Demonstrating an entropy-driven phase transition:**

i) G&T Problem 4.34

ii) G&T Problem 4.56

**8: Fluctuations in a mole of gas:**

What is the probability that a mole of ideal gas at temperature  $T$  will have an energy that differs by a factor of  $10^{-6}$  (i.e. one part in a million) from its mean energy?

*Hint: Section 4.14.2 of G&T*