

# MATH327: Statistical Physics

Monday, 13 February 2023

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## Something to consider

The air in this room consists of  $\sim 10^{25}$  molecules.

How can we analyze this through the framework of probability spaces?

What sort of large-scale behaviour should we expect to predict?

## Recap

Random walk - generic tool ~~to~~ to model stochastic processes

$$\text{Drift velocity } v_{dr} = \frac{N_m}{t} = \frac{\mu}{\Delta t}$$

$$\text{Diffusion constant } D = \sqrt{\frac{N\sigma^2}{t}} = \sqrt{\frac{\sigma^2}{\Delta t}}$$

$$\text{Law of diffusion } \Delta x = D\sqrt{t}$$

Related to central limit theorem

$$p(x) = \frac{1}{\sqrt{2\pi D^2 t}} \exp\left[-\frac{(x - v_{dr} t)^2}{2D^2 t}\right]$$

Spin systems & statistical ensembles

First law of thermodynamics = conservation of energy

## Plan

Micro-canonical ensemble

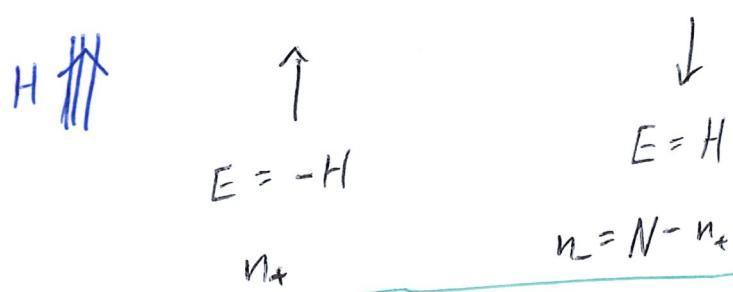
Thermodynamical equilibrium

Entropy

Second law

## Spin system

Energy as interaction between spin external magnetic field  $H > 0$



$$\text{Total energy } E = (-H)n_+ + (H)n_- = -H(2n_+ - N)$$

$$E(\uparrow\downarrow\uparrow\uparrow\downarrow\uparrow\uparrow) = -H(2 \cdot 6 - 8) = -4H < 0$$

with energy  $E = -4H$  conserved

what fraction of states are allowed?

$$\text{Fraction} = \frac{\# \text{ allowed}}{\# \text{ total}} = \frac{\binom{8}{6}}{2^8} = \frac{8 \cdot 7 / 2}{256} = \frac{28}{256} = \frac{7}{64} \approx 11\%$$

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Energy of  $N \sim 10^{25}$  point particles

$$E = \frac{m}{2} \sum_{n=1}^N \vec{v}_n^2 = \frac{1}{2m} \sum_{n=1}^N \vec{p}_n^2 \quad \vec{p}_n = m\vec{v}_n$$

Practically impossible solve  $\sim 10^{25}$  time-evolution equations  
or even specify  $\sim 10^{25}$  initial conditions

Instead treat time evolution as stochastic process

$$w_1 \rightarrow w_2 \rightarrow w_3 \rightarrow \dots$$

$w_i$  is micro-states

Statistical ensemble is set of all micro-states

$$\Omega = \{w_1, w_2, \dots\}$$

accessible through time evolution

Each micro-state  $w_i$  has probability  $p_i$  of being adopted  
→ probability space

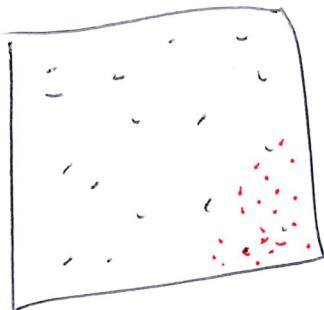
$\sum p_i = 1 \rightarrow$  system must be in some micro-state at any time

Conserved quantities unchanged under time evolution  
→ characterize statistical ensemble

Micro-canonical ensemble characterized by  
conserved internal energy  $E$   
and conserved particle number  $N$

Energy conservation implies isolation!

Physical intuition: Expect steady, smooth, stable behaviour



equilibrium  
focus of this module

Consider micro-canonical system  $\Omega$   
 $M$  micro-states  $w_i$

Thermodynamic equilibrium if and only if  
all probabilities  $p_i$  equal

$$\text{Finite } M \rightarrow p_i = \frac{1}{M} \quad \text{so} \quad \sum_{i=1}^M p_i = M \left( \frac{1}{M} \right) = 1$$

Equilibrium system continues adopting different micro-states  
"steady" not "static", equilibrium is dynamic

Emergence of steady behaviour related to entropy

Consider statistical ensemble  $\Omega$  with countable # of micro-states M

Entropy is  $S = -\sum_{i=1}^M p_i \log p_i$

Specialize to micro-canonical ensemble in equilibrium

$$p_i = \frac{1}{M} \rightarrow S = -M \left(\frac{1}{M}\right) \log \left(\frac{1}{M}\right) = -\log \frac{1}{M} = \log M$$

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Boltzmann's equation

Micro-canonical  $\rightarrow$  conserved  $E, N$

In equilibrium, derived quantities like entropy steady & stable even though system dynamically adopts different micro-states  
 $\rightarrow$  Entropy function of conserved quantities,  $S(E, N)$   
 $\{E, N, M\}$  inter-related

### Spin system examples

$N$  spins with  $H=0 \rightarrow$  all  $M=2^N$  micro-states have same  $E=0$   
 $S = \log M = \log 2^N = N \log 2$

Turn on magnetic field  $H>0$

Now  $E=0$  only if  $n_+ = n_-$

What is entropy?  $S = \log M$

$$M = \binom{N}{n_+} \quad N = n_+ + n_- = \underline{2n_+}$$

$$M = \binom{2n_+}{n_+} = \frac{(2n_+)!}{(n_+!)^2}$$

$$S = \log M = \log \left[ \frac{(2n_+)!}{(n_+!)^2} \right] = \log [(2n_+)!] - 2 \log (n_+!)$$

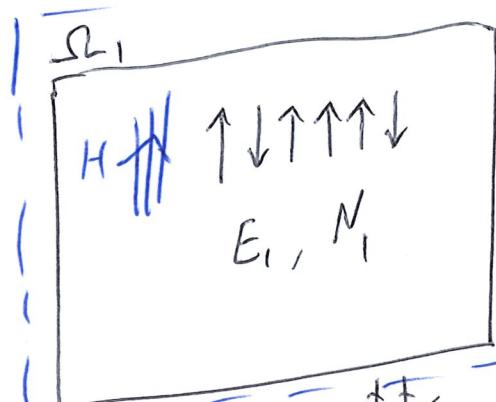
Suppose  $N=8 \rightarrow n_+ = n_- = 4$

$$S = \log \left[ \frac{8!}{4! \cdot 4!} \right] = \log \left( \frac{8 \cdot 7 \cdot 6 \cdot 5}{4 \cdot 3 \cdot 2} \right) = \log (70)$$

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IF  $M \rightarrow \infty$  then  $S = \log M \rightarrow \infty$

Entropy is extensive - consider two isolated systems



$M_1$  micro-states  
probabilities  $p_i$

$$S_1 = - \sum_{i=1}^{M_1} p_i \log p_i$$

$M_2$  micro-states

probabilities  $q_k$

$$S_2 = - \sum_{k=1}^{M_2} q_k \log q_k$$

Analyze as combined system  $\Omega_{1+2}$

How many micro-states  $M_{1+2}$ ?

Isolated subsystems statistically independent

$M_1$  micro-states for each  $w_i \rightarrow M_{1+2} = M_1 M_2$

$p_i$  probabilities  $p_i q_k$

$q_k$

$$\text{Sanity check } \sum_{M_{1+2}} p_i p_j q_k = \sum_{i=1}^{M_1} \sum_{k=1}^{M_2} p_i q_k = \left( \sum_i p_i \right) \left( \sum_k q_k \right) = 1 \quad \checkmark$$

$$\text{Entropy } S_{1+2} = - \sum_{ik} p_i q_k \log(p_i q_k) = - \sum_{ik} p_i q_k (\log p_i + \log q_k)$$

$$= - \sum_i p_i \log p_i \sum_k q_k - \sum_i p_i \sum_k q_k \log q_k$$

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$$= S_1 + S_2$$

Extensive entropy  $S_{1+2} = S_1 + S_2$  for independent subsystems

energy  $E_{1+2} = E_1 + E_2$  particle #  $N_{1+2} = N_1 + N_2$

Intensive quantities independent of extent of system (temperature density)

$M_{1+2} = M_1 M_2$  neither intensive nor extensive

Suppose each subsystem behaves independently in therm. equil.

$$p_i = \frac{1}{M_1}$$

$$q_h = \frac{1}{M_2}$$

$$S_1 = \log M_1$$

$$S_2 = \log M_2$$

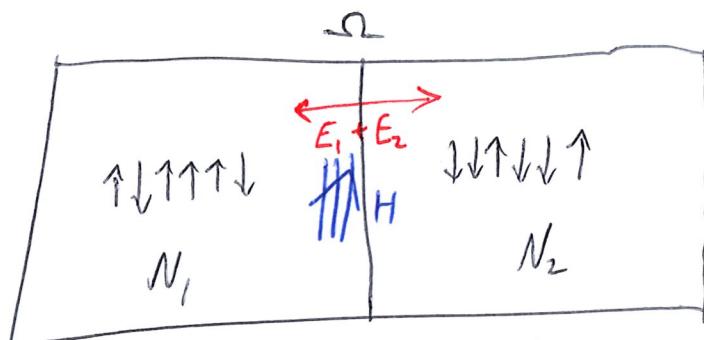
$$p_i q_h = \frac{1}{M_1 M_2} = \frac{1}{M_{1+2}} \rightarrow \text{also in equilibrium}$$

$$S_{1+2} = \log(M_{1+2}) = \log(M_1 M_2) = \log M_1 + \log M_2 = S_1 + S_2 \checkmark$$

### Thermal contact

Allow two subsystems to exchange energy (not particles)

Wait for equilibrium



$\Omega$  is not  $\Omega_{1+2}$

Total  $E = E_1 + E_2$  still conserved  $\rightarrow \Omega$  is micro-canonical  
subsystems are not

What is total # of micro-states  $M$  for overall  $\Omega$

Use energy conservation  $\rightarrow e_1$  from  $N_1$  spins }  $M_{e_1} = M_{e_1}^{(1)} M_{E-e_1}^{(2)}$   
 $E - e_1$  from  $N_2$  spins }

Possible for  $e_1 = E_1 \rightarrow$  account for all  $M_{1+2} = M_1 M_2$

$$\begin{matrix} M_{e_1}^{(1)} \\ | \\ M_{E-e_1}^{(2)} \end{matrix}$$

$$\text{Overall } M = \sum_{e_1} M_{e_1}^{(1)} M_{E-e_1}^{(2)} = M_1 M_2 + \sum_{e_1 \neq E_1} M_{e_1}^{(1)} M_{E-e_1}^{(2)} \geq M_1 M_2$$

Equality only for extremely special case  
that  $\{E_1, E_2\}$  only possible energy distribution

$$M \geq M_1, M_2 \rightarrow S = \log(M) \geq \log(M_1, M_2) = S_{1+2}$$

(at therm. equil.)

## Second law of thermodynamics

When isolated systems in therm. equil.  
 brought into thermal contact  
 entropy  $S \geq S_{1+2} = S_1 + S_2$  can never decrease  
 (increases except in extremely special cases)

More generally, entropy never decreases as time passes  
 and generically increases

Provides more general definition of thermodynamic equilibrium  
 System is in therm. equil. if its entropy is maximal

Holds for micro-canonical and other ensembles  
 $\hookrightarrow$  Can recover earlier definition

Need to maximize  $S = -\sum_i p_i \log p_i$   
 requiring conserved  $E, N$  and  $\sum_i p_i = 1$   
 Use Lagrange multiplier

$$\bar{S}(\lambda) = S + \lambda \left( \sum_i p_i - 1 \right) = -\sum_i p_i \log p_i + \lambda \left( \sum_i p_i - 1 \right)$$

Maximize  $\bar{S}(\lambda)$  and then impose  $\sum_i p_i = 1$

$$\text{then } \frac{\partial \bar{S}}{\partial \lambda} = 0$$

$\rightarrow$  maximum  $\bar{S}$  corresponds to max. of  $S = \bar{S}(\lambda=0)$

$$\frac{\partial \bar{S}}{\partial p_h} = 0 = \frac{\partial}{\partial p_h} \left[ -\sum_i p_i \log p_i + \lambda \left( \sum_i p_i - 1 \right) \right]$$

$$= -\log p_h - \frac{p_h}{p_h} + \lambda \quad \left| \begin{array}{l} \log p_h = \lambda - 1 \\ p_h = e^{\lambda-1} = \text{const.} \end{array} \right.$$

$$= 1/M \quad \checkmark$$