# **04. Entropy in Statistical Mechanics**

- <u>Goal</u>: To explain the behavior of *macroscopic* systems in terms of the dynamical laws governing their *microscopic* consituents.
  - *In particular*: To provide a *micro-dynamical* explanation of the 2nd Law.

## **1.** Boltzmann's Approach to Statistical Mechanics

• Consider different "macrostates" of a gas at constant energy:





• Why does the gas prefer to be in the equilibrium macrostate (last one)?



Ludwig Boltzmann (1844-1906)



• Suppose the gas consists of *N* particles governed by Hamilton's equations of motion (the micro-dynamics).

**Def. 1** (*Microstate*). A **microstate** *x* of an *N*-particle system is a specification of the position (3 values) and momentum (3 values) for each of its *N* particles.

Let  $\Gamma = phase space = 6N$ -dim space of all possible microstates.

Let  $\Gamma_E$  = region of  $\Gamma$  that consists of all microstates with constant energy *E*.

Hamiltonian dynamics maps initial microstate  $x_i$  to final microstate  $x_f$ .

Can 2nd Law be explained in terms of this dynamics?



**Def. 2** (*Macrostate*). A **macrostate**  $\Gamma_M$  of a physical system is a specification of the system in terms of macroscopic properties (pressure, temperature, volume, *etc*.).

• <u>Relation between microstates and macrostates</u>:



*Macrostates supervene on microstates!* 

- To each microstate there corresponds exactly one macrostate.
   Many distinct microstates can correspond to the same macrostate.
- <u>So</u>:  $\Gamma_E$  is partitioned into a finite number of regions  $\Gamma_M$  corresponding to macrostates, with each microstate x belonging to one macrostate.





**Def. 3** (*Boltzmann entropy*). The **Boltzmann entropy**  $S_{\text{Boltz}}(\Gamma_M)$  of a macrostate  $\Gamma_M$  of an isolated physical system at constant energy is given by  $S_{\text{Boltz}}(\Gamma_M) \equiv k \ln |\Gamma_M|$ , where  $|\Gamma_M|$  is the size of  $\Gamma_M$ .

**Claim**.  $S_{\text{Boltz}}$  increases over time because, for any initial microstate  $x_i$ , the dynamics will map  $x_i$  into  $\Gamma_{M_{\text{eq}}}$  very quickly, and then keep it there for an extremely long time.

But why?

### Two Ways to Explain the Approach to Equilibrium:

(a) <u>Appeal to Typicality</u> Goldstein (2001)

**Claim.** A system approaches equilibrium because equilibrium microstates are *typical* and nonequilibrium microstates are *atypical*.

- <u>Why?</u> For large N,  $\Gamma_E$  is almost entirely filled up with equilibrium microstates. Hence they are "typical".
  - *But*: What is it about the *dynamics* that evolves atypical states to typical states?
    - "If a system is in an atypical microstate, it does not evolve into an equilibrium microstate *just because* the latter is typical." (Frigg 2009)
  - Need to identify properties of the dynamics that guarantee atypical states evolve into typical states.
  - *And*: Need to show that these properties are typical.
    - <u>Ex</u>: If the dynamics is *chaotic* (in an appropriate "ergodic" sense), then (under certain conditions), any initial microstate  $x_i$  will quickly be mapped into  $\Gamma_{eq}$  and remain there for long periods of time. (Frigg 2009)

## (b) <u>Appeal to Probabilities</u>

**Claim**. A system approaches equilibrium because it evolves from states of lower toward states of higher probability, and the equilibrium state is the state of highest probabililty.

• Associate probabilities with macrostates: the larger the macrostate, the greater the probability of finding a microstate in it.

"In most cases, the initial state will be a very unlikely state. From this state the system will steadily evolve towards more likely states until it has finally reached the most likely state, i.e., the state of thermal equilibrium."



Task: Make this a bit more precise (Boltzmann's combinatorial argument)...

### Coarse-graining the single-particle phase space



 $\frac{Arrangement \#1:}{\text{state } s_6 \text{ in } \omega_1, \text{ state } s_{89} \text{ in } \omega_3, etc.}$ 

- Start with the *6-dim* phase space  $\Gamma_{\mu}$  of a single particle.
- Partition  $\Gamma_{\mu}$  into  $\ell$  cells  $\omega_1$ , ...,  $\omega_{\ell}$  of size  $\delta \omega$ .
- A state of an *N*-particle system is given by *N* points in  $\Gamma_{\mu}$ .

**Def. 4**. An **arrangement** is a specification of *which* states lie in which cells.

S - A point in Γ<sub>μ</sub> is a singleparticle microstate. - Γ<sub>E</sub> = N copies of Γ<sub>μ</sub>

#### Coarse-graining the single-particle phase space



<u>Arrangement #1:</u> state  $s_6$  in  $\omega_1$ , state  $s_{89}$  in  $\omega_3$ , etc.

<u>Arrangement #2:</u> state  $s_{89}$  in  $\omega_1$ , state  $s_6$  in  $\omega_3$ , etc.



- Start with the 6-dim phase space  $\Gamma_{\mu}$  of a single particle.
- Partition  $\Gamma_{\mu}$  into  $\ell$  cells  $\omega_1$ , ...,  $\omega_{\ell}$  of size  $\delta\omega$ .
- A state of an *N*-particle system is given by *N* points in  $\Gamma_{\mu}$ .

**Def. 4**. An **arrangement** is a specification of *which* states lie in which cells.

More than one arrangement can correspond to the same distribution!

 $\leq$  - A point in  $\Gamma_{\mu}$  is a single-

particle microstate. -  $\Gamma_E = N$  copies of  $\Gamma_\mu$ 

**Def. 5.** A **distribution**  $D = (n_1, n_2, ..., n_\ell)$  is a specification of *how many* states (regardless of *which* ones) lie in each cell.

How many arrangements G(D) are compatible with a given  $D = (n_1, n_2, ..., n_\ell)$ ?

• <u>Answer</u>:

$$G(D) = \frac{N!}{n_1! n_2! \cdots n_\ell!} =$$

Number of ways to arrange N distinguishable objects into  $\ell$  bins with capacities  $n_1, n_2, ..., n_{\ell}$ .

$$n! = n(n-1)(n-2)\cdots 1$$
  
= # of ways to arrange n  
distinguishable objects  
 $0! = 1$ 

<u>*Check*</u>: Let  $D_1 = (N, 0, ..., 0)$  and  $D_2 = (N - 1, 1, 0, ..., 0)$ .

 $G(D_1) = \frac{N!}{N!} = 1$   $\leftarrow$  Only one way for all N particle states to be in  $w_1$ .

$$G(D_2) = \frac{N!}{(N-1)!} = \frac{N(N-1)(N-2)\cdots 1}{(N-1)(N-2)\cdots 1} = N \quad \leftarrow \quad \text{There are } N \text{ different ways } w_2 \text{ could have one state in it; } namely, if s_1 \text{ was in it, or if } s_2 \text{ was in it, or if } s_3 \text{ was in it, etc..}$$

How many arrangements G(D) are compatible with a given  $D = (n_1, n_2, ..., n_\ell)$ ?

• <u>Answer</u>:

$$G(D) = \frac{N!}{n_1! n_2! \cdots n_\ell!} =$$

Number of ways to arrange N distinguishable objects into  $\ell$  bins with capacities  $n_1, n_2, ..., n_{\ell}$ .

 $n! = n(n-1)(n-2)\cdots 1$ = # of ways to arrange n distinguishable objects 0! = 1

**Assumption 1**. The *probability* of a distribution D is given by G(D).

"The probability of this distribution [D] is then given by the number of permutations of which the elements of this distribution are capable, that is by the number [G(D)]. As the most probable distribution, i.e., as the one corresponding to thermal equilibrium, we again regard that distribution for which this expression is maximal..."



### In other words:

**Claim.** The equilibrium distribution is the distribution that maximizes G(D).

<u>Next task</u>: What form does this distribution take?

**Assumption 2.** Each distribution *D* corresponds to a macrostate  $\Gamma_{M_D}$ .

<u>Why</u>? A system's macroscopic properties (volume, pressure, temp, etc) only depend on how many particles are in particular microstates, and not on which particles are in which microstates.

#### What is the size of this macrostate?

- A point in (the big phase space)  $\Gamma_E$  corresponds to an arrangement in (the singleparticle phase space)  $\Gamma_{\mu}$ .
- The size of a macrostate  $\Gamma_{M_D}$  in  $\Gamma_E$  is given by the number of points it contains (the number of arrangements compatible with *D*) multiplied by a *volume element* of  $\Gamma_E$ .
- A volume element of  $\Gamma_E$  is given by *N* copies of a volume element  $\delta \omega$  of  $\Gamma_{\mu}$ .

• So: The size of 
$$\Gamma_{M_D}$$
 is  $|\Gamma_{M_D}| = \begin{pmatrix} \# arrangements \\ compatible with D \end{pmatrix} \times \begin{bmatrix} volume \\ element of \Gamma_E \end{pmatrix}$   
 $= G(D)\delta\omega^N$  The probability  $G(D)$  of D is proportional to the size of  $\Gamma_{M_D}$   
• Hence:  $S_{\text{Boltz}}(\Gamma_{M_D}) = k\ln(G(D)\delta\omega^N)$   
 $= k\ln(G(D)) + Nk\ln(\delta\omega)$   
 $= k\ln(G(D)) + \text{const.}$   $\int_{\text{Boltz}} S_{\text{Boltz}} as a measure of how probable a macrostate is.}$ 

# *Other formulations of S*<sub>Boltz</sub>:

<u>What distribution  $D^* = (n_1^*, ..., n_\ell^*)$  maximizes  $S_{\text{Boltz}}(n_i)$ ?</u>

**Assume**: The  $n_i$  are constrained by Assume: The  $n_i$  are constrained by (a)  $\sum_{i=1}^{\ell} n_i = N$  (b)  $\sum_{i=1}^{\ell} \varepsilon_i n_i = U$  Weak interaction assumption: The total internal energy U = sumof the energies  $\varepsilon_i$  of each particle

• To maximize  $S_{\text{Boltz}}(n_i)$ , set its derivative to zero and solve for  $n_i$ :

 $(d/dn_i)S_{\text{Boltz}}(n_i) = -k\sum_i (d/dn_i)(n_i \ln n_i + \text{const.}) = -k\sum_i (\ln n_i + 1)$ 

- <u>Or</u>:  $dS_{\text{Boltz}} = -k\sum_{i}(\ln n_i + 1)dn_i$  Small changes to  $S_{\text{Boltz}}$  due only to small changes  $dn_i$
- Now find values  $n_i^*$  that solve:  $dS_{\text{Boltz}} = -k\sum_{i} (\ln n_{i}^{*} + 1) dn_{i} = 0 \quad \longleftarrow \quad \text{subject to constraints} \begin{cases} dN = \sum_{i} dn_{i} = 0 \\ dII = \sum_{i} dn_{i} = 0 \end{cases}$
- Can add arbitrary multiples of the constraints and still get zero:

$$dS_{\text{Boltz}} = \sum_{i} (-k \ln n_i^* - \alpha - \beta \varepsilon_i) dn_i = 0$$

• <u>So</u>:  $k \ln n_i^* + \alpha + \beta \varepsilon_i = 0$ or

$$n_i^* = e^{-(\alpha + \beta \varepsilon_i)/k} = e^{-\alpha/k} e^{-\beta \varepsilon_i/k}$$

Now put this into a (slightly) nicer form...

<u>What distribution  $D^* = (n_1^*, ..., n_\ell^*)$  maximizes  $S_{\text{Boltz}}(n_i)$ ?</u>

Assume: The  $n_i$  are constrained by (a)  $\sum_{i=1}^{\ell} n_i = N$  (b)  $\sum_{i=1}^{\ell} \varepsilon_i n_i = U$ 

• Enforce (a) on  $n_i^* = e^{-\alpha/k} e^{-\beta \varepsilon_i/k}$ 

$$\sum_{i} n_{i}^{*} = N = e^{-\alpha/k} \sum_{i} e^{-\beta \varepsilon_{i}/k}$$
 or  $e^{-\alpha/k} = N/Z$ ,  $Z \equiv \sum_{i} e^{-\beta \varepsilon_{i}/k}$ 

- <u>So</u>:  $n_i^* = (N/Z)e^{-\beta \varepsilon_i/k}$
- <u>Hence</u>:

$$D^* = (n_1^*, \dots, n_\ell^*) = \left(\frac{N}{Z}e^{-\beta\varepsilon_1/k}, \dots, \frac{N}{Z}e^{-\beta\varepsilon_\ell/k}\right)$$

S The "Maxwell-Boltzmann distribution"

<u>Boltzmann's claim</u>: D\* is the equilibrium distribution

### <u>How S<sub>Boltz</sub> relates to S<sub>TD</sub></u>

• *<u>Consider</u>*: Small changes in internal energy of a reversible process:

Macroscopic point of view	<u>Microscopic point of view</u>
$dU = \delta Q - dW$	$dU = d(\sum_i \varepsilon_i n_i)$
$=TdS_{\rm TD}-PdV$	$=\sum_{i} \varepsilon_{i} dn_{i} + \sum_{i} n_{i} d\varepsilon_{i}$

- *Intuitions*:
  - A change in volume dV causes a change in energy  $d\varepsilon_i$ .
  - A change in entropy  $dS_{TD}$  is related to a change in microstate number  $dn_i$ .
- <u>Suggests</u>:  $PdV = -\sum_{i} n_i d\varepsilon_i$  and  $dS_{TD} = (1/T)\sum_{i} \varepsilon_i dn_i$
- <u>Note</u>: For the Max-Boltz equilibrium distribution  $n_i^* = \frac{N}{Z} e^{-\beta \varepsilon_i/k}$ :

• <u>So</u>: For the M-B equilibrium distribution,  $S_{Boltz} = S_{TD}$ , provided  $\beta = 1/T$ .

#### <u>What this shows</u>:

- For a *large number* of *weakly interacting* particles in an equilibrium state, it is *consistent* to identify the Boltzmann entropy  $S_{Boltz}$  with the thermodynamic entropy  $S_{TD}$ .
- <u>But</u>:
  - Assumes the Maxwell-Boltzmann distribution  $D^*$  that maximizes  $S_{\text{Boltz}}$  is the equilibrium distribution (i.e., just another way of assuming that the largest macrostate is the equilibrium macrostate).
  - $S_{\text{TD}}$  measures absolute changes in heat per temperature of a reversible process; whereas  $S_{\text{Boltz}}$  measures the size of a macrostate.
  - For thermally isolated processes,  $S_{TD}$  absolutely increases or remains constant; whereas there is no absolute law that requires  $S_{Boltz}$  to increase or remain constant.

What about the dynamics of a system entails that it will evolve:

- to the largest macrostate?
- to the most typical macrostate?
- to the most probable macrostate?

*Boltzmann*: Analysis of a *single* multiparticle system.

- Point *x* in  $\Gamma_E$ : possible microstate of system.
- Function f on  $\Gamma_E$ : a property of the system in terms of its micro-properties (positions/momenta of its particles).
- <u>Problem</u>: Observed macro-properties (temp, pressure, volume, etc) are <u>time averages</u> of micro-properties.

Very difficult to calculate! (Must keep track of all positions and momenta of particles of the system over a given period of time!)

• <u>Gibbs' Solution</u>:

Replace

*Time average* of a property of a single system over a period of time.

with

"*Ensemble average*" of the property over infinitely many copies of the system at an instant of time!

Much easier to calculate! All you need is a weighting system defined on all the copies; i.e., a distribution  $\rho(x)$  defined on  $\Gamma$ !



*Boltzmann*: Analysis of a *single* multiparticle system.

- Point *x* in  $\Gamma_E$ : possible microstate of system.
- Function f on  $\Gamma_E$ : a property of the system in terms of its micro-properties (positions/momenta of its particles).



- Point *x* in Γ: microstate of one member of ensemble.
- Function f on  $\Gamma$ : a property of the system in terms of its micro-properties.
- *Distribution*  $\rho(x)$  on  $\Gamma$ : state of entire ensemble.

 $\longrightarrow Not Boltzmann's D$  $or <math>\rho_{\mu}(x_{\mu})!$ 



("And here we may set the problem, not to follow a particular system through its succession of configurations, but to determine how the whole number of systems will be distributed among the various conceivable configurations and velocities at any required time, when the distribution has been given for some one time."



Willard Gibbs (1839-1903)

*Boltzmann*: Analysis of a *single* multiparticle system.

- Point *x* in  $\Gamma_E$ : possible microstate of system.
- Function f on  $\Gamma_E$ : a property of the system in terms of its micro-properties (positions/momenta of its particles).

<u>Gibbs</u>: Analysis of an ensemble of infinitely many copies of same system.

- Point x in  $\Gamma$ : microstate of one member of ensemble.
- Function f on  $\Gamma$ : a property of the system in terms of its micro-properties.
- *Distribution*  $\rho(x)$  on  $\Gamma$ : state of entire ensemble.



- *Boltzmann*: The state of a multiparticle system is represented by a point x in  $\Gamma_E$ .
- *Gibbs*: The state of a multiparticle system is represented by an ensemble  $\{\Gamma, \rho(x)\}$ , which is a collection  $\Gamma$  of possible states, with each state x weighted by a probability  $\rho(x)$ .

Willard Gibbs (1839-1903)





Not Boltzmann's D or  $\rho_{\mu}(x_{\mu})!$ 

*Boltzmann*: Analysis of a *single* multiparticle system.

- Point *x* in  $\Gamma_E$ : possible microstate of system.
- Function f on  $\Gamma_E$ : a property of the system in terms of its micro-properties (positions/momenta of its particles).

*<u>Gibbs</u>*: Analysis of an *ensemble* of infinitely many copies of same system.

- Point x in  $\Gamma$ : microstate of one member of ensemble.
- Function f on  $\Gamma$ : a property of the system in terms of its micro-properties.
- Distribution  $\rho(x)$  on  $\Gamma$ : state of entire ensemble. Not Boltzmann's D or  $\rho_u(x_u)!$

 $\int_{S} \rho(x) dx \qquad \longleftarrow \begin{array}{l} Probability of finding state \\ of a system in region S \end{array}$  $\langle f \rangle \equiv \int_{\Gamma} f(x) \rho(x) dx \qquad \longleftarrow \begin{array}{l} Ensemble average of f \end{array}$ 

- *Stationary distribution*: constant in time.
  - <u>Note</u>:  $\langle f \rangle$  is constant just when  $\rho$  is stationary.



Willard Gibbs (1839-1903)

If macro-properties are repre-

sented by ensemble averages,

then they don't change in time

for stationary distributions.

**Averaging Principle**: The measured value of a property f of a system in thermodynamic equilibrium is the ensemble average  $\langle f \rangle$  of an ensemble in statistical equilibrium (i.e., an ensemble with a stationary distribution).

<u>*Justification*</u>: A measurement of a property *f* takes some amount of time, which is "infinite" compared to molecular processes. - <u>So</u>: What gets measured in the lab is the infinite time average  $f^*(x_0)$ :  $f^*(x_0) = \lim_{\tau \to \infty} \frac{1}{\tau} \int_{t_0}^{t_0 + \tau} f(\phi_t(x_0)) dt$ - <u>And</u>: For sufficiently chaotic ("ergodic") systems,  $\langle f \rangle = f^*(x_0)$ . **Def. 6** (*Gibbs entropy*). The **Gibbs entropy**  $S_{\text{Gibbs}}(\rho)$  of an ensemble distribution  $\rho$  is the ensemble average of the quantity  $-k \ln \rho$ :  $S_{\text{Gibbs}}(\rho) \equiv -k \int_{\Gamma} \rho(x) \ln \rho(x) dx$ 

• Compare with "continuous" version of  $S_{\text{Boltz}}$ :

$$S_{\text{Boltz}}(\Gamma_M) = -Nk \int_{\Gamma_\mu} \rho_\mu(x_\mu) \ln \rho_\mu(x_\mu) dx_\mu$$

- $S_{\text{Boltz}}$  is an integral over the *single-particle* phase space  $\Gamma_{\mu}$  of the *constant-energy* subregion  $\Gamma_E$  of  $\Gamma$ .
- $S_{\text{Gibbs}}$  is an integral over the full phase space  $\Gamma$  (not even restricted to  $\Gamma_E$ ).

<u>However</u>: One can show that  $S_{Gibbs}$  reduces to  $S_{Boltz}$  for the case of a system of N identical, weakly interacting particles at constant energy...

### How S<sub>Gibbs</sub> relates to S<sub>Boltz</sub>

- *Consider*: A system of *N* identical, weakly interacting particles at constant energy.
- Characterized by distribution given by:

 $\rho(x) = \rho_{\mu}^{1}(x_{\mu}^{1})\rho_{\mu}^{2}(x_{\mu}^{2})\cdots\rho_{\mu}^{N}(x_{\mu}^{N}), \text{ such that } \rho_{\mu}^{i} = \rho_{\mu}^{i} \text{ for all } i, j$   $Meakly \text{ interacting particles:} Single-particle distribution for constant-energy of individual probabilities microstates of particle 1} Identical particles: all individual probabilities are equal}$ 

• For this distribution:

#### Two standard Gibbs distributions

- For any given physical system, there can be many different ways to define  $\rho$ .
  - Minimally, we want a  $\rho$  that is stationary and maximizes  $S_{\text{Gibbs}}$ .

**Def. 7** (*Microcanonical distribution*). For an isolated system with fixed energy H(x) = E, the **microcanonical distribution**  $\rho_{mc}$  is given by:  $\rho_{mc} = \begin{cases} 1/\Omega(E), & \text{for } H(x) = E & \underbrace{\text{Motivation: All microstates with}}_{same energy have equal probability} \\ 0, & \text{otherwise} \end{cases}$ where  $\Omega(E) = \int_{\Gamma_E} dx$  is the number of microstates with H(x) = E.

• Note:  

$$S_{\text{Gibbs}}(\rho_{\text{mc}}) = -k \int_{\Gamma} \rho_{\text{mc}}(x) \ln \rho_{\text{mc}}(x) dx$$

$$= -k \int_{\Gamma_{E}} (1/\Omega(E)) \ln [1/\Omega(E)] dx$$

$$= -k (1/\Omega(E)) \ln [1/\Omega(E)] \int_{\Gamma_{E}} dx$$

$$= k \ln \Omega(E)$$

A measure of the number of microstates of the system

<u>S<sub>Boltz</sub> as a special case of S<sub>Gibbs</sub>. Part II:</u> The Boltzmann entropy  $S_{Boltz}(\Gamma_M)$  of a macrostate of an isolated N-particle system at constant energy can be thought of as the Gibbs entropy  $S_{Gibbs}(\rho_{mc})$  of the microcanonical distribution for an ensemble of N weakly interacting systems. **Def. 8** (*Canonical distribution*). For a non-isolated system *S* in equilibrium with a heat bath *R* at fixed temperature *T* and fixed *total* energy  $H(x) = E = E_R + E_S$ ,  $E_S \ll E$ , the **canonical distribution**  $\rho_c$  is given by:

$$o_{\rm c}(x) = Z^{-1} e^{-\beta H(x)}$$

where  $Z = \int e^{-\beta H(x)} dx$ , and  $\beta = 1/T$ .

<u>S<sub>Boltz</sub> as a special case of S<sub>Gibbs</sub>. Part III:</u> The Gibbs canonical distribution  $\rho_c$  is the generalization of the Maxwell-Boltzmann distribution for a single system to an ensemble of systems consisting of one in equilibrium with the rest.

#### Interpretive Issues:

- (1) *Why* do low-probability states evolve into high-probability states? What justifies a given stationary,  $S_{\text{Gibbs}}$ -maximizing distribution  $\rho(x, t)$ ?
  - Characterizations of the dynamics are, again, required to justify this.
- (2) *How* are the probabilities to be interpreted?
  - (a) *Ontic probabilities* = properties of physical systems
    - Long run frequencies?
    - Single-case propensities?
  - (b) *Epistemic probabilities* = measures of degrees of belief
    - Objective (rational) degrees of belief?
    - Subjective degrees of belief?



#### So how can the Gibbs entropy $S_{\text{Gibbs}}(\rho)$ increase?



**Claim 1.**  $S_{\text{Gibbs}}(\rho_{\text{coarse}}) \ge S_{\text{Gibbs}}(\rho)$ 

**Claim 2.** Under various assumptions (ergodicity, "molecular randomness", etc.), for  $t_1 > t_0$ ,

 $S_{\text{Gibbs}}(\rho_{\text{coarse}})|_{t=t_1} \ge S_{\text{Gibbs}}(\rho_{\text{coarse}})|_{t=t_0}$ 

