BIO311 note

(Modeling for Computational Biology)

Sequence	Method	Assessment Type (EXAM or CW)	(Use codes under	Duration	Week		Resit (Y/N/S)
#001	Assignment 1	CW	ABCDEF			25	N
#002	Assignment 2	CW	GH			15	N
#003	Written examination	EXAM	ALL	3 hour(s)		60	N

1 Kinematics

1.1 Definition of Kinematics

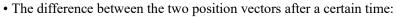
- · A branch of dynamics that deals with aspects of motion apart from considerations of mass and force.
- It concerns the description of the motion of a point (body) or a system of points (bodies) without considering the forces that cause the motion.



1.2 Position and reference systems

- Origin (O): The point in space that serves as the zero point for the coordinate system. All positions are measured relative to this point.
- · Oriented axes: Imaginary lines that intersect at the origin and extend in specific directions. In a three-dimensional space, there are typically three axes (x, y, z) that are perpendicular to each other. The axes are oriented vectors with positive and negative directions.
- Scale: A scale defines how distances are measured along the axes. It determines the units of measurement.
- The position of a point P is completely determined by the position vector $\mathbf{r} = \mathbf{OP} = (x, y, z)$.

Since our object moves in space, after some time it will be in a new position r' = OP' = (x', y', z').



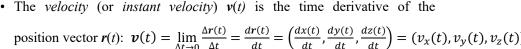
$$\mathbf{s} = \Delta \mathbf{r} = \mathbf{O} \mathbf{P}' - \mathbf{O} \mathbf{P} = (x' - x, y' - y, z' - z) = (\Delta x, \Delta y, \Delta z)$$

1.3 Velocity

- As the point P moves in time, the vector position r is a function of time: $\mathbf{r} \equiv \mathbf{r}(t) = (x(t), y(t), z(t))$
- The average velocity v_{ave} in a time interval is defined as the displacement vector divided by the time interval in which the displacement happens:

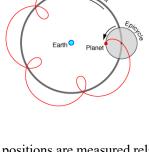
$$v_{ave} = \frac{\Delta r(t)}{\Delta t} = \frac{r(t + \Delta t)}{\Delta t} = \frac{s}{\Delta(t)} = \frac{(\Delta x, \Delta y, \Delta z)}{\Delta t} =$$

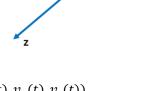
$$\frac{(x(t_2) - x(t_1), y(t_2) - y(t_1), z(t_2) - z(t_1))}{t_2 - t_1}$$



position vector $\mathbf{r}(t)$: $\mathbf{v}(t) = \lim_{\Delta t \to 0} \frac{\Delta \mathbf{r}(t)}{\Delta t} = \frac{d\mathbf{r}(t)}{dt} = \left(\frac{dx(t)}{dt}, \frac{dy(t)}{dt}, \frac{dz(t)}{dt}\right) = (v_x(t), v_y(t), v_z(t))$

So, the velocity of a point is a vector, whose components are the time derivatives of the components of the position





 $\mathbf{r}' = \mathbf{r}(t_2)$

vector.

1.4 Uniform linear motion

- A body moving with constant velocity v is said to move according to a uniform linear motion.
- The law of motion for such body can be obtained by integrating both sides of the velocity equation using the time as independent variable:

$$v(t) = \frac{d\mathbf{r}(t)}{dt}$$

$$\int_{t}^{t+\Delta t} v dt' = \int_{t}^{t+\Delta t} \frac{d\mathbf{r}(t)}{dt} dt' \blacktriangleleft$$

$$v\Delta t = \mathbf{r}(t + \Delta t) - \mathbf{r}(t)$$

$$\mathbf{r}(t + \Delta t) = \mathbf{r}(t) + v\Delta t \blacktriangleleft$$

$$v = (v_{x}, v_{y}, v_{z})$$

$$x(t + \Delta t) = x(t) + v_{x}\Delta t$$

$$y(t + \Delta t) = y(t) + v_{y}\Delta t$$

$$z(t + \Delta t) = z(t) + v_{z}\Delta t$$

1.5 Acceleration

• The acceleration a(t) is the time derivative of the velocity v(t):

$$\boldsymbol{a}(t) = \lim_{\Delta t \to 0} \frac{\Delta \boldsymbol{v}(t)}{\Delta t} = \frac{d\boldsymbol{v}(t)}{dt} = \left(\frac{d\boldsymbol{v}_{\boldsymbol{x}}(t)}{dt}, \frac{d\boldsymbol{v}_{\boldsymbol{y}}(t)}{dt}, \frac{d\boldsymbol{v}_{\boldsymbol{z}}(t)}{dt}\right) = (a_{\boldsymbol{x}}(t), a_{\boldsymbol{y}}(t), a_{\boldsymbol{z}}(t))$$

• Since the velocity is the time derivative of the position, the acceleration is the second derivative of the position with respect to time:

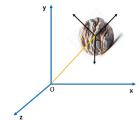
$$a(t) = \frac{d^2 \mathbf{r}(t)}{dt^2} = \left(\frac{d^2 x(t)}{dt^2}, \frac{d^2 y(t)}{dt^2}, \frac{d^2 z(t)}{dt^2}\right)$$

- The acceleration is a vector, whose components are the time derivatives of the components of the velocity vector.
- So here we put the Uniform linear motion equation into position related version:

$$\begin{cases} x(t + \Delta t) = x(t) + v_x \Delta t = x(t) + v_x(t) \Delta t + \frac{1}{2} a_x (\Delta t)^2 \\ y(t + \Delta t) = y(t) + v_y \Delta t = y(t) + v_y(t) \Delta t + \frac{1}{2} a_y (\Delta t)^2 \\ z(t + \Delta t) = z(t) + v_z \Delta t = z(t) + v_z(t) \Delta t + \frac{1}{2} a_z (\Delta t)^2 \end{cases}$$

1.6 Degrees of freedom and configuration space

- Degrees of freedom are the variable that needs to be known to describe a (static) system completely. A single point in 3-dimension has 3 degrees of freedom, and they are usually associated with the three components of its position vector (x, y, z).
- A system composed of N bodies in 3-dimension has 3N degrees of freedom and can be described by a vector in a 3N-dimensional space, which is called the configuration space: $\mathbf{r} = (x_1, y_1, z_1, x_2, y_2, z_2, ..., x_N, y_N, z_N)$
- Due to constraints (chemical bounds, physical delimitations, etc.), the accessible space is a subset of the 3N-dimensional space.
- For example, for a rigid body, the relative positions between the different parts of the system do not change with time. A rigid body has 6 degrees of freedom (i.e. 3 coordinates for its position and three angles that define its orientation in space) (Translation degrees of freedom & Rotation degrees of freedom).



1.7 Momentum

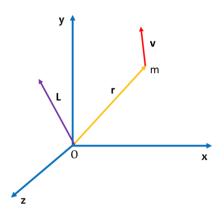
• We define the momentum of an object of mass m moving with velocity v as the product between the mass and the velocity:

$$p = mv$$

- Then the total momentum for a system of N particles is the sum of the momenta of each individual particle: $p_{TOT} = \sum_{i=1}^{N} m_i v_i$
- The total momentum of a system is conserved if the system is isolated.

1.8 Angular Momentum

- We define the angular momentum of an object of mass m moving with velocity v as the cross product between its position vector and its momentum: L = r × p = r × mv
- Then the *total angular momentum* for a system of N particles is the sum of the angular momenta of each individual particle: $\mathbf{L}_{TOT} = \sum_{i=1}^{N} \mathbf{r} \times \mathbf{p}_i = \sum_{i=1}^{N} \mathbf{r} \times m_i \mathbf{v}_i$
- The total angular momentum of a system is conserved if the system is isolated.



1.9 The Phase Space

A dynamic system of N particles with masses mi can be described when positions and velocities (or better momenta) are completely known. Position and momentum vectors of the system are both 3N-dimensional vectors, so that whole system can be considered a point in a 6N-dimensional space:

$$\mathbf{r} = (x_1, y_1, z_1, x_2, y_2, z_2, \dots, x_N, y_N, z_N)$$

$$\mathbf{p} = (p_{x1}, p_{y1}, p_{z1}, p_{x2}, p_{y2}, p_{z2}, \dots, p_{xN}, p_{yN}, p_{zN})$$

As for the configuration space, due to constraints, the accessible space is a subset of the 6N-dimensional space. We call this subspace the phase space.

2 Dynamics: forces, work and energy

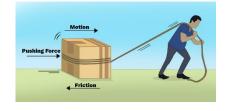
2.1 Newton's laws of motion

- A body remains at rest or in motion at a constant speed in a straight line, except insofar as a force act upon it.
- The acceleration of an object is directly proportional to the net force acting on it and inversely proportional to its mass.
- If two bodies exert forces on each other, these forces have the same magnitude but opposite directions.

$$\mathbf{F} = m\mathbf{a} = m\frac{d\mathbf{v}}{dt} = \frac{d(m\mathbf{v})}{dt} = \frac{d\mathbf{p}}{dt}$$

2.2 Example of forces

- Gravity: $F = -G \frac{m_1 m_2}{r^2}$ and $\mathbf{F} = m\mathbf{g}$
- Electrostatic: $F = \frac{1}{4\pi\epsilon_0} \frac{q_1 q_2}{r^2}$
- Friction: $F = -\mu N$



2.3 Work

We consider an object of mass m, moving according to a certain trajectory γ , under the action of external forces.

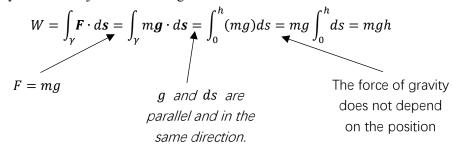
• **Definition**: we call elementary work done by the force F the quantity: $\delta W = F \cdot ds$

(where ds is an infinitesimal vector displacement along γ)

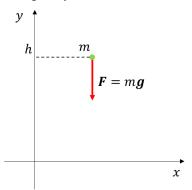
• **Definition**: the work done by the force F along the trajectory γ is the integral of the elementary work along the curve γ :

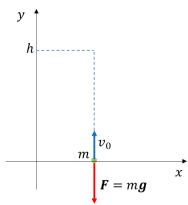
$$W = \int_{\mathcal{V}} \mathbf{F} \cdot d\mathbf{s}$$

• **Example**: An object of mass m is left to fall with initial velocity v_0 =0 from a height h. We want to calculate the work done by the force of gravity when the object reaches the ground.



So, the force of gravity is constant and it is always parallel and in the same direction of the motion.





Let us now consider the case in which the force and the direction of motion are antiparallel (opposite directions).

This is the case of an object leaving the ground with velocity $v_0 > 0$. We know that the object will reach a certain height h, where its velocity will be 0. At that point, it will start descending (as in the previous case).

And the work done in the ascending phase is:

$$W = \int_{\gamma} \mathbf{F} \cdot d\mathbf{s} = \int_{\gamma} m\mathbf{g} \cdot d\mathbf{s} = -\int_{0}^{h} (mg)ds = -mg \int_{0}^{h} ds = -mgh$$

(Which equals to the opposite of the work done by gravity in the descending phase)

2.4 Work and Kinetic Energy

Let us consider again the case of a falling object. We want to calculate the change in velocity when the object reaches the ground. From the equation of the uniformly accelerated motion:

$$\begin{cases} v_f = v_0 + gt \\ h = v_0 t + \frac{1}{2}gt^2 \end{cases} \Rightarrow t = \frac{v_f - v_0}{g} \Rightarrow h = \frac{1}{2g}(v_f^2 - v_0^2)$$

If we multiply each term of last equation for mg we obtain the following relationship:

$$mgh = \frac{1}{2}mv_f^2 - \frac{1}{2}mv_0^2$$

$$W = mgh$$
 and $K = \frac{1}{2}mv^2$

$$\therefore W = K_f - K_i = \Delta K$$
 (Work-Energy theorem)

Multiple forces can act on an object at the same time. Forces sum linearly (as vectors). The total work done on the object is the sum of the work done by each force:

$$F_{NET} = F_1 + F_2 + \dots + F_N = \sum_{i=1}^{N} F_i$$

$$W_{NET} = \int F_{NET} \cdot ds = \int (F_1 + F_2 + \dots + F_N) \cdot ds = \int F_1 \cdot ds + \dots + \int F_N \cdot ds = W_1 + \dots + W_N$$

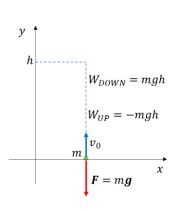
This means that the total change in kinetic energy is given by the sum of the work done by each of the forces acting on the object: $\Delta K = \sum_{i=1}^{N} W_i$



3 Potential energy and Conservation of energy

3.1 Work in closed circuits

- We have seen that if we launch an object from the ground, the work done by the force of gravity in the ascending path is equal and opposite of the work done in the descending part: $W_{UP} = -W_{DOWN}$
- When the object reaches the ground again, the net work done by the force of gravity is 0: $W_{NET} = W_{UP} W_{DOWN} = 0$
- This can be extended to arbitrary circuits in space: The work done by the force of gravity



on a circuit is always null.

• For a generic circuit, we can break the trajectory in a sum of small displacements. At each step, we can decompose the displacement in two components, one parallel and one orthogonal to the force of gravity. But the result stays the same.

$$ds = ds_{\parallel} + ds_{\perp}$$
 $W_{NET} = \int_{\gamma} m \boldsymbol{g} \cdot ds = \int_{\gamma} m \boldsymbol{g} \cdot (ds_{\parallel} + ds_{\perp}) = \int_{\gamma} m \boldsymbol{g} \cdot ds_{\parallel} + \int_{\gamma} m \boldsymbol{g} \cdot ds_{\perp}$

$$\int_{V} m\boldsymbol{g} \cdot d\boldsymbol{s}_{\perp} = 0 \quad (\boldsymbol{g} \text{ and } d\boldsymbol{s}_{\perp} \text{ are orthogonal})$$

$$\int_{\gamma} m\mathbf{g} \cdot d\mathbf{s}_{\parallel} = mg \int_{y(A)}^{y(A)} dy = 0$$

$$W_{NET} = 0$$

3.2 Work along different paths

- Conclusion: The work done by the force of gravity to move from point A to point B does not depend on the chosen path.
- Suppose we are moving from point A to point B using the red path and come back to A using the cyan path. The net work done in the cycle is the sum of the two contributions and it is zero as we completed the cycle:

$$W_{NET} = W_{AB(R)} + W_{BA(C)} = 0$$

• On the other hand, the work done to go from point B to A (let's say on the cyan path) is equal and opposite to work done from A to B using the same path:

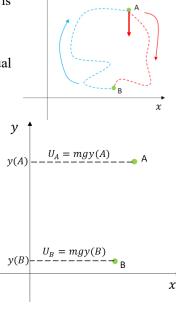
$$W_{NET} = W_{AB(R)} + W_{BA(C)} = W_{AB(R)} - W_{AB(C)} = 0 \Rightarrow W_{AB(R)} = W_{AB(C)}$$



Since the work done by the gravitational force on an object that moves from point A to point B, does not depend on the path, but only on the starting and ending point, we can write it as the difference of a function of the coordinates of A or B:

$$W_{AB} = U_A - U_B = -\Delta U$$

U is called potential energy (is a form of energy). It is a property of an object interacting with a force field, and it depends on the object's position (or orientation) in space. For the gravitational force, a good choice of the functional form of U is U=mgy, for any arbitrary origin of the reference system y=0.



3.4 Conservation of Energy

• The work-energy theorem tells us that the work done to an object by an arbitrary force causes a variation of the kinetic energy.

• As A and B are arbitrary points in space, the relationship above is valid for any point in space. If we introduce the quantity $E_{TOT} = K + U$, the total energy of the object we have:

$$E_{TOT} = K + U = const$$

• This means that the total energy of an object moving under the effect of a gravitational field is always conserved.

3.5 Conservative forces

Conservative forces

- The work done is independent on the path.
- The work in a circuit is always zero.
- The potential energy can be defined.
- The total energy is conserved.
- Examples: gravitation, electromagnetic force, literally every fundamental force, harmonic forces.

Non-Conservative forces

- The work done depends on the path.
- The work in a circuit is not zero.
- The potential energy cannot be defined.
- The total energy cannot be defined.
- Examples: friction, viscous friction, other kind of frictions...

3.6 Relationship between Force and Potential Energy

• If we consider first the 1-dimensional case (force and displacement happens in the same line). From the definition of

elementary work we have: $\delta W = \mathbf{F} \cdot d\mathbf{s} = F dx$

On the other hand, if the force is conservative, we can write: $\delta W = -dU$

By comparing the two equations we obtain the following relationship, we have: $F = -\frac{dU}{dx}$

- It's seeming that U is a function only of the space U = U(x), this means that conservative forces do not depend on the velocity of the object on which they act and they do not change with time.
- In general, the potential energy does not depend on a single coordinate. In this case, the force is given by the opposite of the gradient of the potential energy: $\mathbf{F} = -\nabla \mathbf{U} = \left(-\frac{\partial U}{\partial x}, -\frac{\partial U}{\partial y}, -\frac{\partial U}{\partial z}\right)$
- An object experiencing an energy potential, feels a force in the direction in which the energy potential is decreasing most rapidly.
- The gravitational energy potential is: U(y) = mgy

The gravitational force is $F = -\frac{dU(y)}{dy} = -mg$

The choice of the zero of the potential energy is arbitrary and does not carry physical meaning. If we add an arbitrary constant to U(y) there are no changes on the gravitational force: $U'(y) = mgy + c \implies F = -\frac{dU(y)}{dy} = -mg$

3.7 Harmonic potential

- Harmonic forces are proportional and in opposition to the displacement.
- They produce periodic motions, and their potential is quadratic.

$$F = -k(x - x_0) \implies U = -\frac{1}{2}k(x - x_0)^2$$

 \rightarrow $x(t) = A\cos(\omega t + \varphi)$













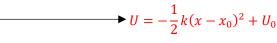


A: amplitude of the motion

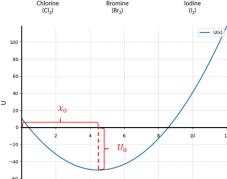
$$\omega = \sqrt{\frac{k}{m}}$$

 φ : depends on the initial position and velocity

• Diatomic molecules (and chemical bonds in general) can be modeled by harmonic potentials.

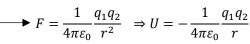


 X_0 : bond distance U_0 : bond energy



3.8 Electrostatic energy potential

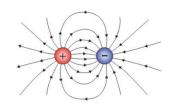
- Electrostatic forces are the forces that charged particles exert on each other.
- The force is attractive if the charges are of opposite signs and repulsive if they are of the same sign.
- The force is determined by the Coulomb law.



 q_1, q_2 : charges of the interacting particles

r: distance between the two particles

 ε_0 : dielectric constant



4 Thermodynamics

4.1 Thermodynamic systems

- A thermodynamic system is a system, separated by its surroundings, made of matter (or radiation) which can be studied by the law of thermodynamics.
- A thermodynamic system is not necessarily isolated and can, in principle, exchange energy or matter with its surroundings.

- Usually, we consider it made of a high number of smaller parts (proteins in a cell, atoms in a protein, etc.).
- The system is usually described by <u>macroscopic</u> variables that can be easily measured, while its <u>components</u> are described by <u>microscopic</u> variables that are not easily accessible.

4.2 Internal energy



We assume that no external force is acting on the system and that the velocity of the system respect to the reference of the lab is v = 0. Each particle will have a certain total energy, given by the sum of the kinetic energy and the potential energy due to the interaction with other particles and the surrounding (the particles collide with each other and the energy can change during the collisions):

$$E_{T,i} = K_i + U_i$$

So, we define the internal energy U of the system the sum of the energies of the particles composing the system:

$$U = \sum_{i=1}^{N} E_{T,i} = \sum_{i=1}^{N} (K_i + U_i)$$

(*U* is a function of the state of the system)

• The energy of a single particle is completely determined once the position and velocity of the particle is known:

$$K_i = \frac{1}{2}v_i^2$$
 $U_i = U_i(r) = U_i(x, y, z)$

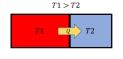
4.3 Pressure

Pressure p the average of the total force exerted by the fluid to the container for unit area:

$$p = \frac{F}{A}$$

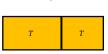
4.4 Thermal equilibrium

Let us consider two thermodynamics systems of different temperatures (T1 and T2, with T1 > T2). We know from experience that if they are put in interaction, they will eventually reach the same temperature T, with T2 < T < T1. The two systems are now in thermal equilibrium.



When this happens, we say that the hotter system has transferred a certain amount of heat (Q) to the colder system.

A thermodynamic system is in thermodynamic equilibrium (with itself) if each of its parts has the same or similar temperatures and pressure.



4.5 Heat transfer and Joule experiment

- The formula of heat transfer: $Q = mc\Delta T$
- The equivalence between work and heat show that heat is a form of energy: W = Q
- In the famous experiment James Prescott Joule demonstrate that the work done on a fluid can increase the temperature of the fluid once equilibrium is reached.

4.6 The first law of thermodynamics 😵

The change of internal energy in a system is equal to the heat absorbed minus the mechanical work done by the system:

$$Q - W = \Delta U$$

As we have seen, ΔU is a state function (i.e. it depends only on the initial and final states of the system and not on the path chosen for moving between states). While neither Q nor W are state function, their difference is a state function.

4.7 Internal energy and temperature

• The internal energy is linked to the temperature:

$$Q = mc\Delta T W = mc\Delta T$$

• The temperature measures the average kinetic energy of the particles in the system.

For monoatomic gases: $\langle K \rangle = \frac{3}{2} k_B T$ $(k_B : \text{Boltzmann constant})$

• In general, heat and work could be "absorbed" by the potential energy part of the internal energy, and not only to increase

the kinetic energy, i.e. the temperature of the system.

$$U = \sum_{i=1}^{N} E_{T,i} = \sum_{i=1}^{N} (K_i + U_i)$$

4.8 The second law of thermodynamics 😯

• The second law of thermodynamics states that the total entropy of an isolated system can never decrease over time; it can only remain constant or increase. In simpler terms, it suggests that natural processes tend to move towards a state of greater disorder or randomness.

$$\sum_{i=1}^{n} \frac{Q_i}{T_i} \le 0$$

And the equality holds only for reversible transformations:

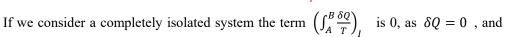
$$\sum_{i=1}^{n} \frac{Q_i}{T_i} = 0$$

This means that the quantity $\frac{\delta Q}{r}$ is a state function when the calculation is done along reversible transformations. We call entropy (S) this state function and the entropy change is defined as:

$$S(B) - S(A) = \int_{A}^{B} \frac{\delta Q}{T}$$

• Let us consider a transformation that move us from state A to state B through an irreversible path, then bring us back through an irreversible path.

$$0 \ge \int_{A}^{A} \frac{\delta Q}{T} = \left(\int_{A}^{B} \frac{\delta Q}{T}\right)_{I} + \left(\int_{B}^{A} \frac{\delta Q}{T}\right)_{R} = \left(\int_{A}^{B} \frac{\delta Q}{T}\right)_{I} - [S(B) - S(A)]$$
$$S(B) - S(A) \ge \left(\int_{A}^{B} \frac{\delta Q}{T}\right)_{I}$$



the previous equation becomes: $S(B) \ge S(A)$

This means for any transformation occurring in an isolated system, the entropy of the final state can never be less than that of the initial state. If the transformation is reversible, the equality sign holds, and the system suffers no change in entropy.

4.9 Free Energy

From the definition of entropy and considering that T is constant we can write:

$$W = -\Delta U + Q$$

$$S(B) - S(A) \ge \int_{A}^{B} \frac{\delta Q}{T} \quad \Rightarrow \quad Q = \int_{A}^{B} \delta Q \le T[S(B) - S(A)]$$

Putting together the two equations we can see that there is an upper limit on the amount of work we can extract from a thermodynamics system, as this inequality holds:

$$W = -\Delta U + Q \le -\Delta U + T[S(B) - S(A)]$$

In other word the total amount of work that can be extracted is limited by the increase of entropy.

• For Gibbs Free Energy:

$$G = H - TS$$

- H is Enthalpy. T is the absolute temperature.
- For Helmholtz Free Energy:

$$F = U - TS$$

- F is the Helmholtz free energy.
- U is Internal Energy.
- T is the absolute temperature.
- S is the Entropy of the system.

Attention: If the free energy is a minimum, the system is in a state of stable equilibrium.

5 Statistical Mechanics

5.1 Thermodynamic variables

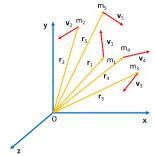
- Extensive Variables: These are properties that depend on the size or extent of the system. They are additive for subsystems and include variables such as mass (m), volume (V), internal energy (U), entropy (S), and the amount of substance (n).
- **Intensive Variables:** These are properties that do not depend on the system size or the amount of material in the system. They include temperature (T) and pressure (p).

5.2 Microstates and macrostates

The state of a system is a vector in a 6N dimensional space:

$$\boldsymbol{\sigma} = (\boldsymbol{r}_1, \boldsymbol{r}_2, ..., \boldsymbol{r}_N, \boldsymbol{v}_1, \boldsymbol{v}_2, ..., \boldsymbol{v}_N) = (x_1, y_1, z_1, x_2, y_2, z_2, ..., x_N, y_N, z_N, v_{x1}, v_{y1}, v_{z1}, v_{x2}, v_{y2}, v_{z2}, ..., v_{xN}, v_{yN}, v_{zN})$$

ullet The vector $oldsymbol{\sigma}$ is the microstate of the thermodynamic system.



- Achieving such a detailed description of a system with many particles is practically impossible and essentially useless, as many microstates can be very similar in practice.
- A macrostate is defined by the macroscopic properties of a system, such as its temperature, pressure, volume, and the number of particles.
- A single macrostate can correspond to a vast number of microscopic configurations (or microstates) of the system's components (like atoms or molecules), which are consistent with the macroscopic properties.

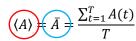
5.3 Macrostates and thermodynamic variables

- Equiprobability Postulate: In an isolated system in thermodynamic equilibrium, all microstates that have the same energy are equally probable.
- Even though microstates are equally probable, macrostates are not. It is easy to understand by thinking of dice rolling. When rolling multiple dice, extreme values become more and more unlikely, and the average becomes more probable.

5.4 Ergodic hypothesis

A thermodynamic system evolves in time following some trajectory in the phase space. If each of the microstates are equally probable, the system will spend more time in macrostates that are represented by a larger number of microstates.

• Under this hypothesis, the phase average of a variable (A) will be equal to the time average:



phase average: average of an time average: average of an over over all the possible time in a particular dynamic microstates of the system trajectory

• We define Ω as the number of microstates that correspond to a certain macrostate. The entropy of the macrostate is (Boltzmann formula for entropy):

$$S = k_B ln \Omega$$

5.5 Systems in thermal equilibrium

In an isolated system in thermodynamic equilibrium, all microstates that have the same energy are equally probable. But if the system is not isolated and can exchange heat (i.e. the total energy is not conserved?)

• For example, let us say that the lower part of the graph has lower energy. In this case, the probability of finding a state of total energy E will be proportional to its Boltzmann factor:

$$P(\sigma) \propto e^{-\frac{E(\sigma)}{k_B T}}$$

- The most probable macrostate will have high entropy and low energy, i.e. low free energy.
- The phase average of a variable (A) is still equal to the time average, because the time past in low energy configuration is on average higher:

$$\underbrace{(A)} = \frac{\sum_{\sigma} A e^{\frac{-E(\sigma)}{k_B T}}}{\sum_{\sigma} e^{\frac{-E(\sigma)}{k_B T}}} = \underbrace{\bar{A}} \Rightarrow \underbrace{\frac{\sum_{t=1}^{T} A(t)}{T}}$$

phase average: average of A over all time average: average of A over time the possible microstates of the system in a particular dynamic trajectory

6 To be continue