MOLECULAR SINULATION From Algorithms to Applications

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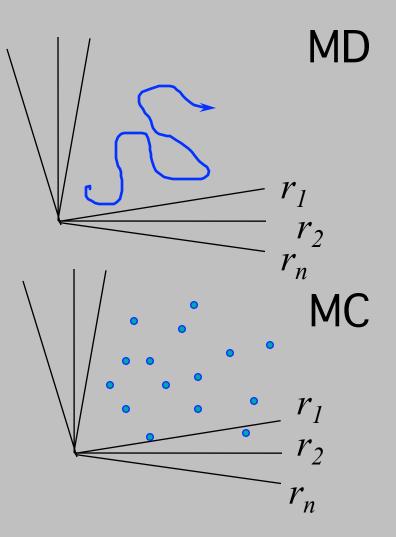
Introduction Statistical Thermodynamics

Daan Frenkel & Berend Smit

Molecular Simulations

 Molecular dynamics: solve equations of motion

 Monte Carlo: importance sampling



Algorithm 1 (Basic Metropolis Algorithm)

```
PROGRAM mc basic Metropolis algorithm

do icycl=1,ncycl perform ncycl MC cycles

call mcmove

if (mod(icycl,nsamp).eq.0)

+ call sample sample sample averages

enddo

end
```

Comments to this algorithm:

- 1. Subroutine mcmove attempts to displace a randomly selected particle (see Algorithm 2).
- 2. Subroutine sample samples quantities every nsampth cycle.

```
attempts to displace a particle
 SUBROUTINE mcmove
                                  select a particle at random
o=int(ranf()*npart)+1
                                  energy old configuration
 call ener(x(o), eno)
                                  give particle random displacement
 xn=x(o) + (ranf() - 0.5) * delx
                                  energy new configuration
call ener(xn, enn)
                                  acceptance rule (3.2.1)
 if (ranf().lt.exp(-beta
                                  accepted: replace x(o) by xn
+ *(enn-eno)) x(o)=xn
 return
end
```

Comments to this algorithm:

- 1. Subroutine ener calculates the energy of a particle at the given position.
- 2. Note that, if a configuration is rejected, the old configuration is retained.
- 3. The ranf () is a random number uniform in [0, 1].

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Question What is the desired distribution?

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Rewrite History

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Other ensembles:

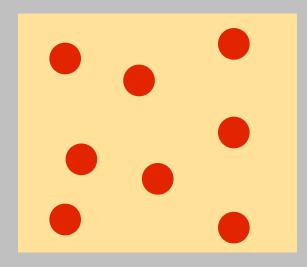
- Constant pressure
- grand-canonical ensemble

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Atoms first thermodynamics next

Daan Frenkel & Berend Smit



We have given the particles an intermolecular potential

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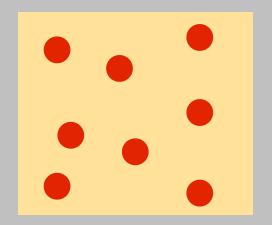
Newton: equations of motion

$$\mathbf{F}(\mathbf{r}) = -\nabla \mathbf{u}(\mathbf{r})$$

$$m\frac{d^2\mathbf{r}}{dt^2} = \mathbf{F}(r)$$

Conservation of total energy

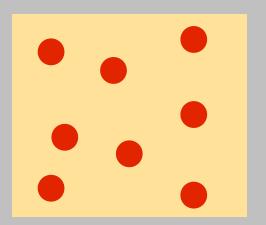
Thermodynamics: N,V,E



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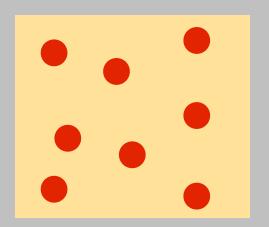
$$\Gamma^{N} = \left\{ \mathbf{r}_{1}, \mathbf{r}_{2}, \dots, \mathbf{r}_{N}, \mathbf{p}_{1}, \mathbf{p}_{2}, \dots, \mathbf{p}_{N} \right\}$$



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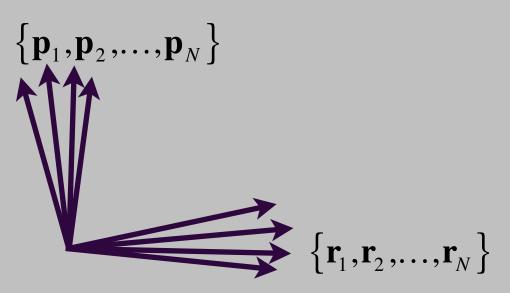
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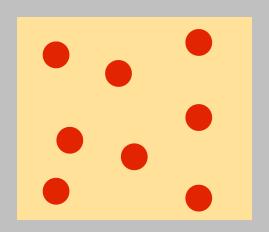


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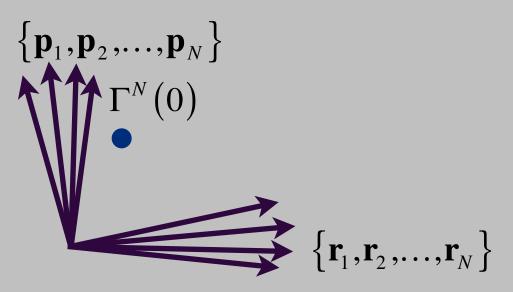


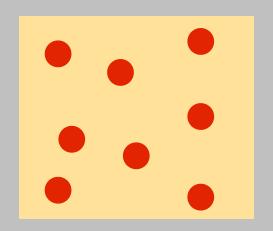


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 $\{\mathbf{p}_1,\mathbf{p}_2,\ldots,\mathbf{p}_N\}$

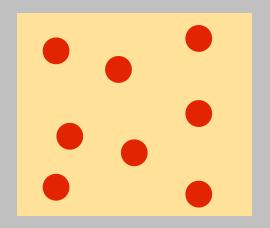
 $^{N}(0)$

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point in phase space

trajectory: classical mechanics

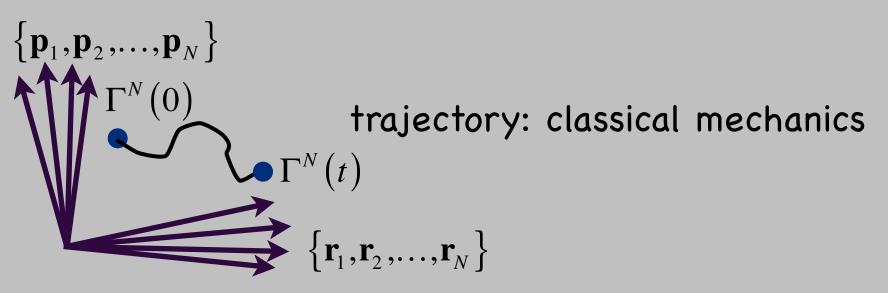
$$[\mathbf{r}_1,\mathbf{r}_2,\ldots,\mathbf{r}_N]$$



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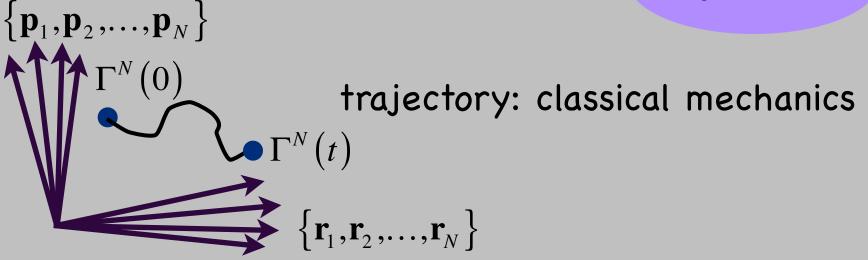
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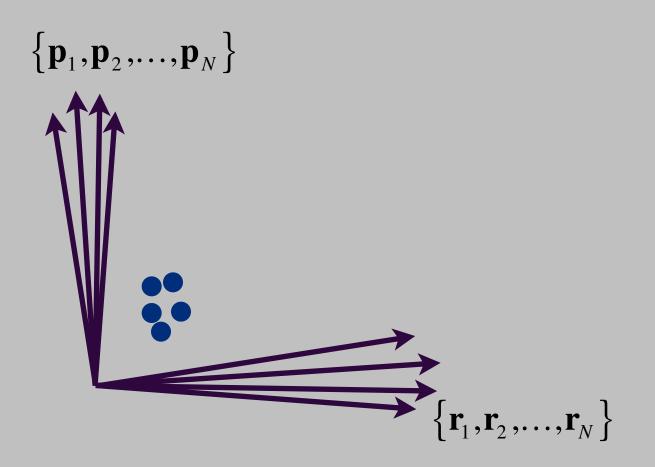
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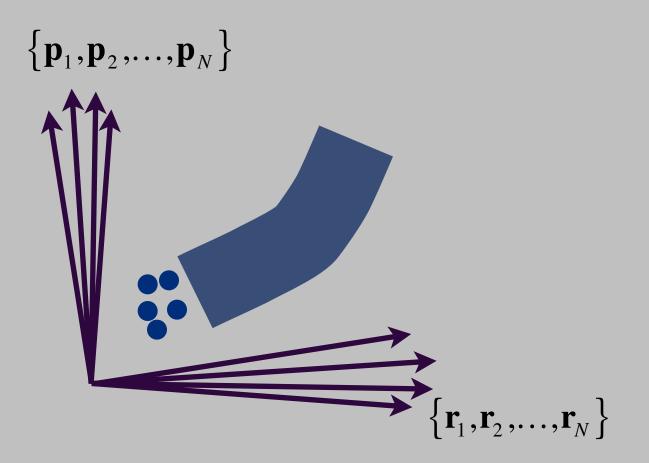
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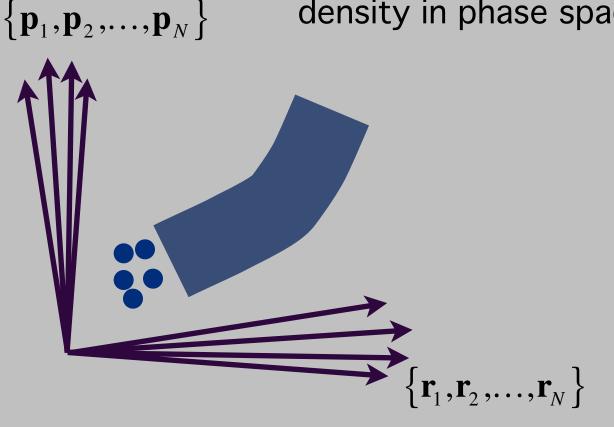
Why this one?







These trajectories define a probability density in phase space



Intermezzo 1: phase rule

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• **Question:** explain the phase rule?

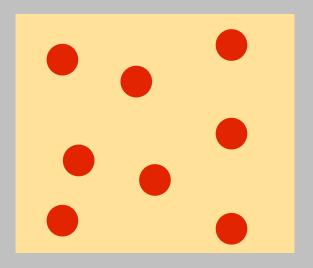
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- Phase rule: F=2-P+C

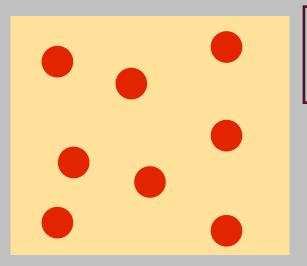
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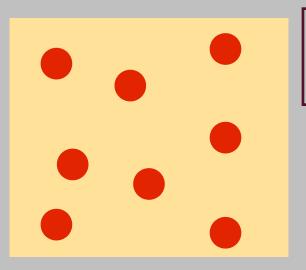
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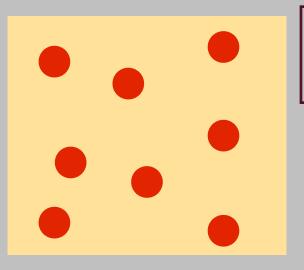


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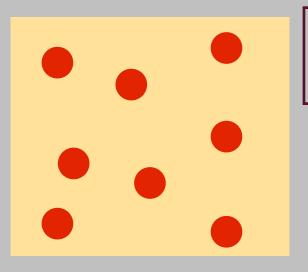
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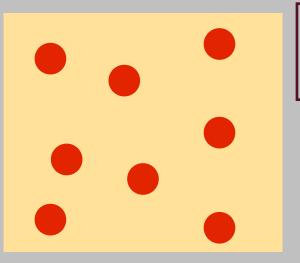
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What do we need to specify to fully define a thermodynamic system?

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 - initial velocities

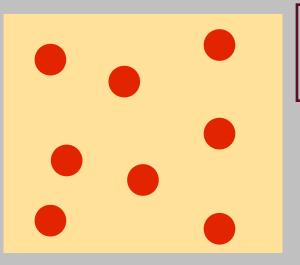


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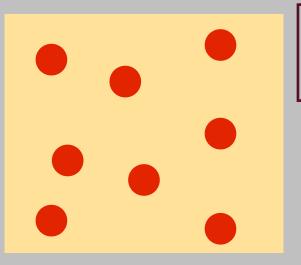


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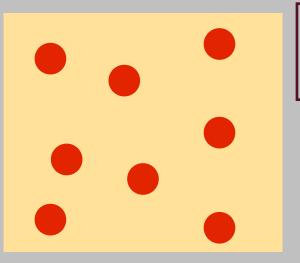


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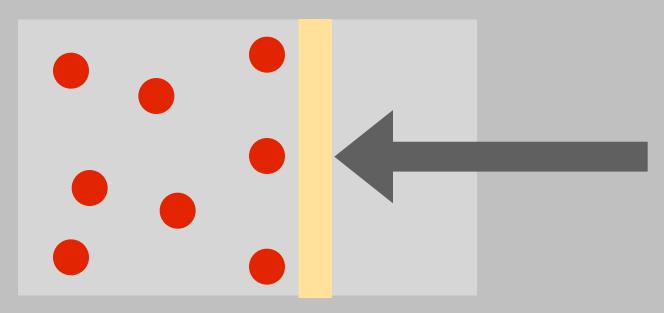
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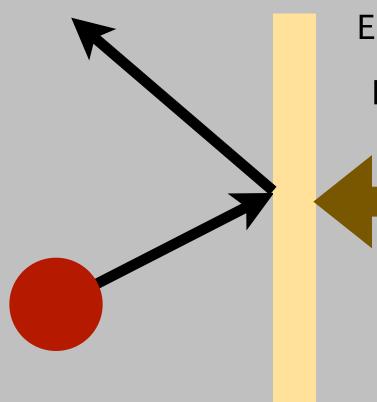
(micro-canonical ensemble)

What is the force I need to apply to prevent the wall from moving?



How much work I do?

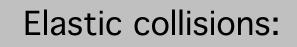
Collision with a wall



Elastic collisions:

Does the energy change?

Collision with a wall



Does the energy change?

What is the force that we need to apply on the wall?

• one particle:

 V_X

2 m

- one particle:
 v_x
- # particles:

2 m

 $\rho A v_x$

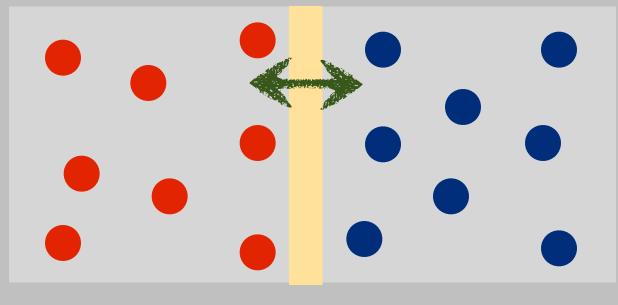
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- Pressure: $P V = N k_B T$

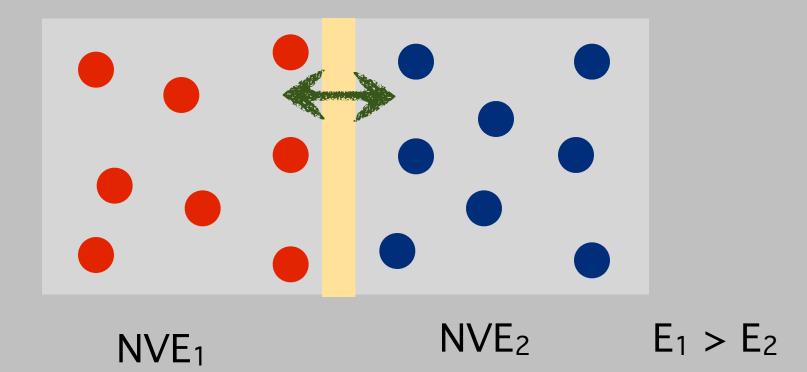
Experiment (1)



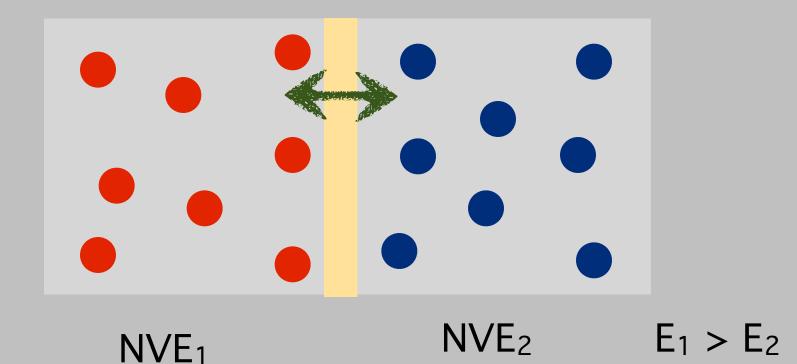
NVE₁

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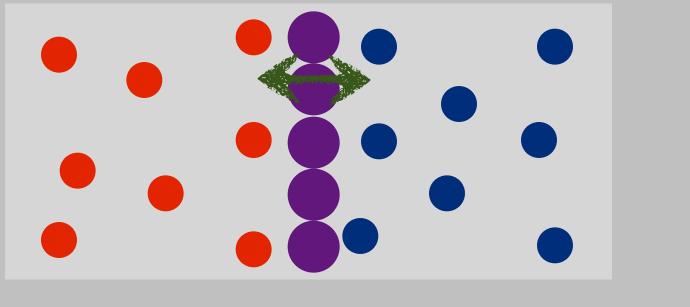


Experiment (1)



What will the moveable wall do?

Experiment (2)

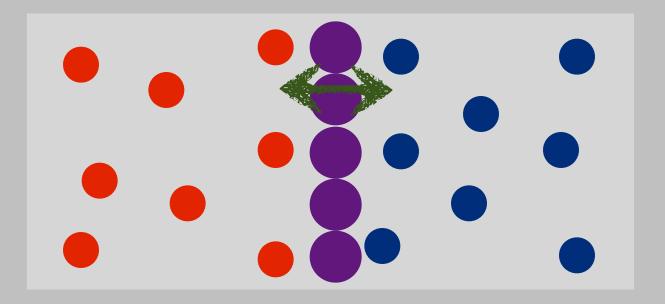


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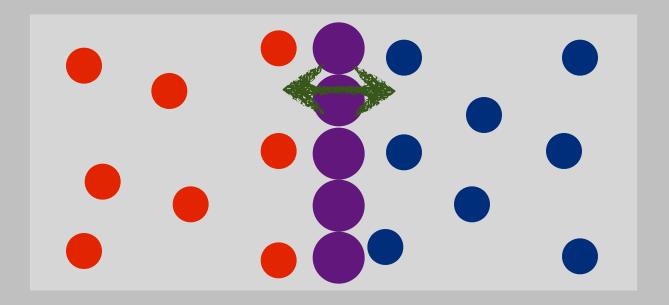
 $E_1 > E_2$

Experiment (2)



NVE_1 NVE_2 $E_1 > E_2$ Now the wall are heavy molecules

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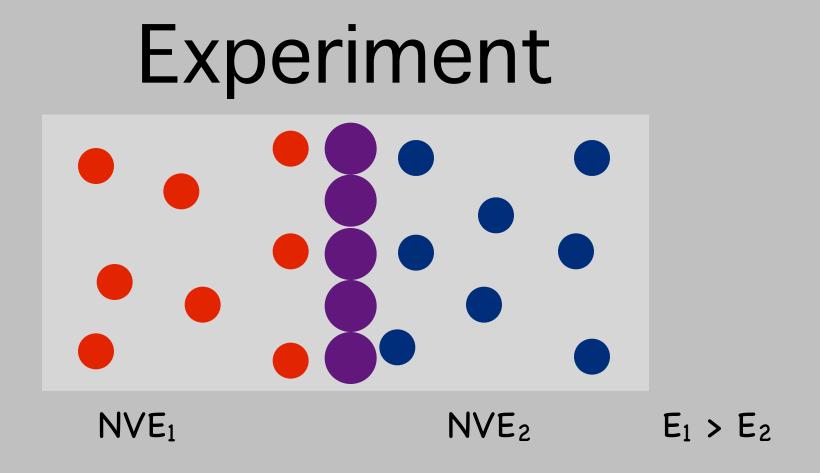
- We have a natural formulation of the first law
- We have discovered pressure
- We have discovered another equilibrium properties related to the total energy of the system

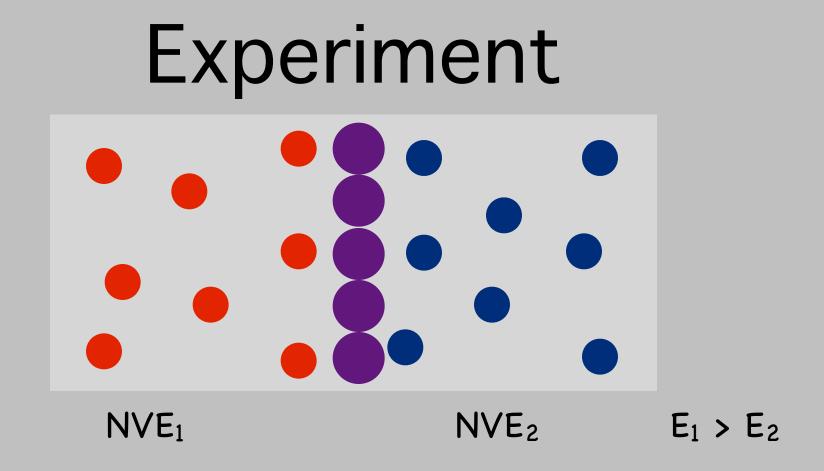
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Thermodynamics (classical)

Daan Frenkel & Berend Smit





The wall can move and exchange energy: what determines equilibrium ?

- 1st law of Thermodynamics
 - Energy is conserved

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- 2nd law of Thermodynamics
 - Heat spontaneously flows from hot to cold

Carnot: Entropy difference between two states:

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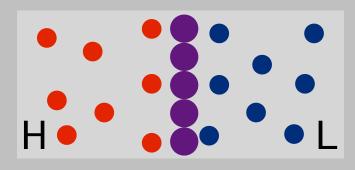
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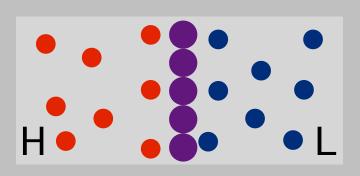
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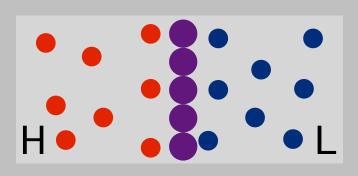
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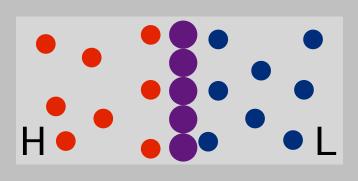
$$dU = TdS - pdV$$





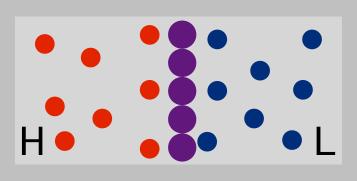


dq is so small that the temperatures of the two systems do not change



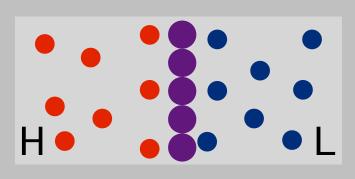
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For system H



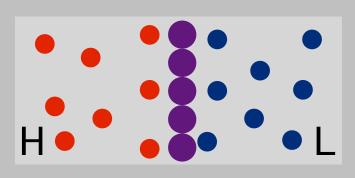
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 $\label{eq:ForsystemH} \text{For system H} \quad \mathrm{d}S_{H} = -\frac{\mathrm{d}q}{T_{H}}$



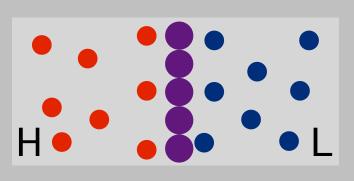
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For system H $dS_H = -\frac{dq}{T_H}$ For system L



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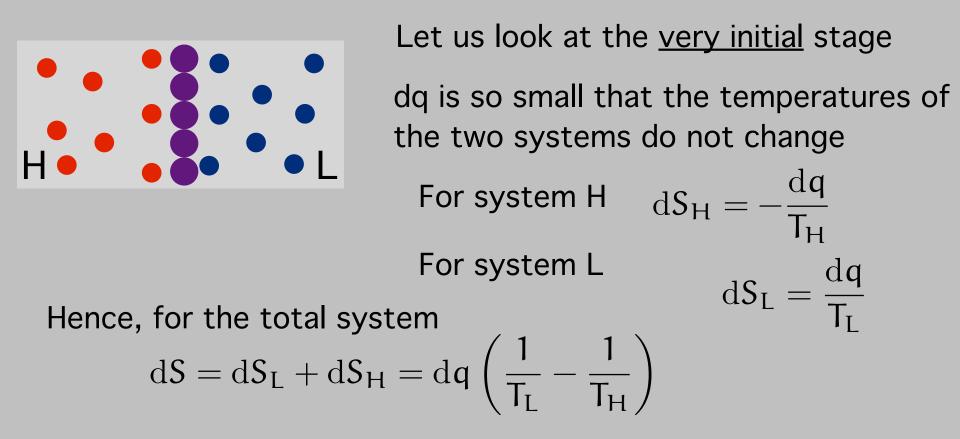
For system H $dS_H = -\frac{dq}{T_H}$ For system L $dS_L = \frac{dq}{T_T}$



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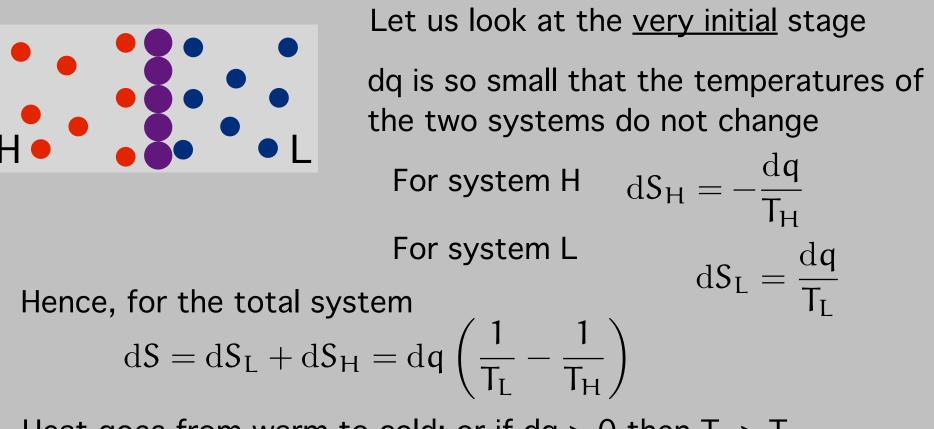
For system H $dS_H = -\frac{dq}{T_H}$ For system L $dS_L = \frac{d}{T_L}$

Hence, for the total system



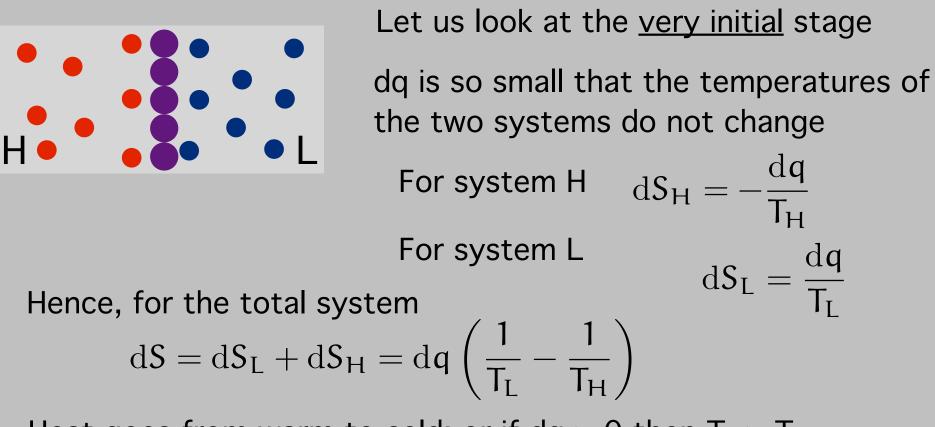
Let us look at the <u>very initial</u> stage dq is so small that the temperatures of the two systems do not change For system H $dS_H = -\frac{dq}{T_H}$ For system L $\mathrm{d}S_{\mathrm{L}} = \frac{\mathrm{d}q}{\mathsf{T}_{\mathrm{L}}}$ Hence, for the total system $\mathrm{dS} = \mathrm{dS}_{\mathrm{L}} + \mathrm{dS}_{\mathrm{H}} = \mathrm{dq}\left(\frac{1}{\mathsf{T}_{\mathrm{I}}} - \frac{1}{\mathsf{T}_{\mathrm{H}}}\right)$

Heat goes from warm to cold: or if dq > 0 then $T_H > T_L$



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This gives for the entropy change: dS > 0



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This gives for the entropy change: dS > 0Hence, the entropy increases until the two temperatures are equal

Question

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- Thermodynamics has a sense of time, but not Newton's dynamics
 - Look at a water atoms in reverse
 - Look at a movie in reverse

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- Thermodynamics has a sense of time, but not Newton's dynamics
 - Look at a water atoms in reverse
 - Look at a movie in reverse
- When do molecules know about the arrow of time?

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Thermodynamics (statistical)

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Basic assumption

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For an isolated system any microscopic configuration is equally likely

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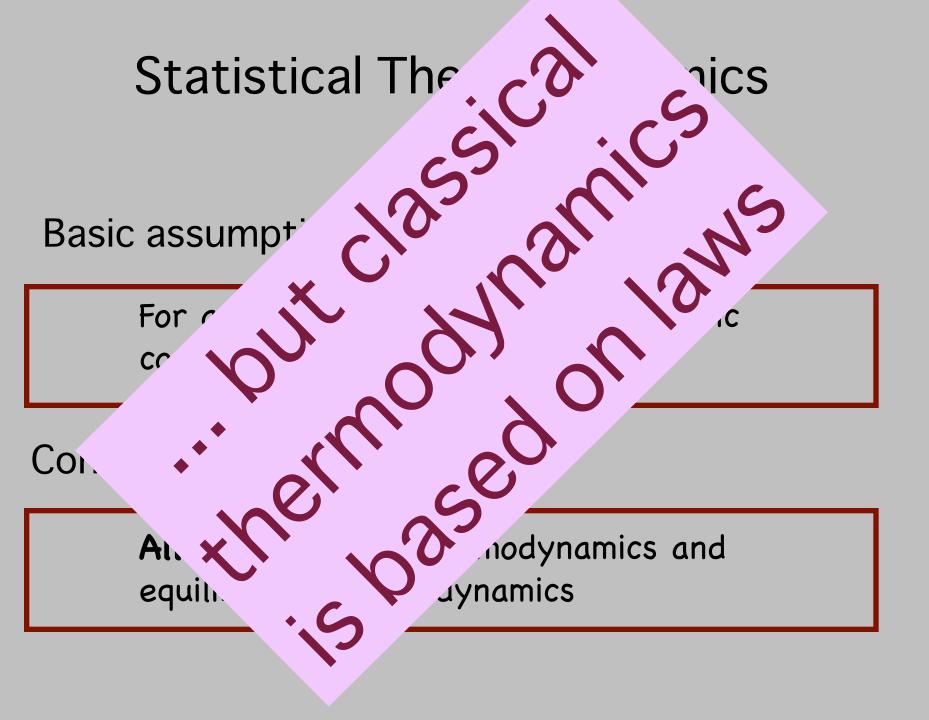
Consequence

Basic assumption

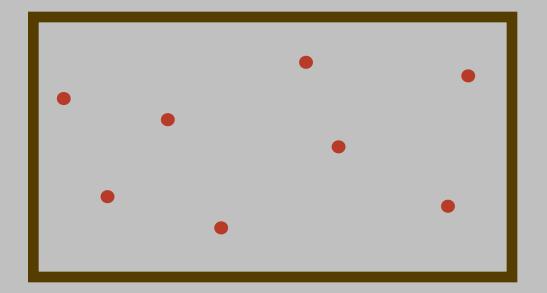
For an isolated system any microscopic configuration is equally likely

Consequence

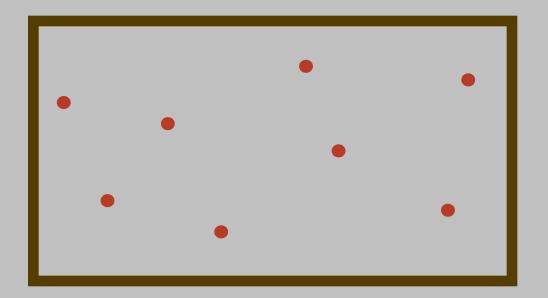
All of statistical thermodynamics and equilibrium thermodynamics



Let us again make an ideal gas

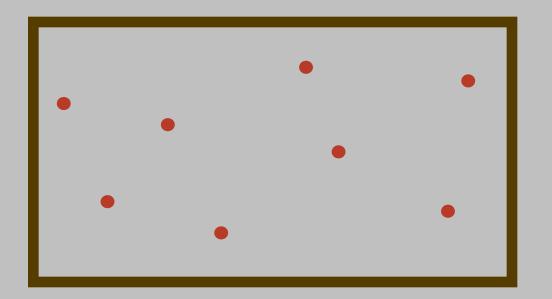


Let us again make an ideal gas



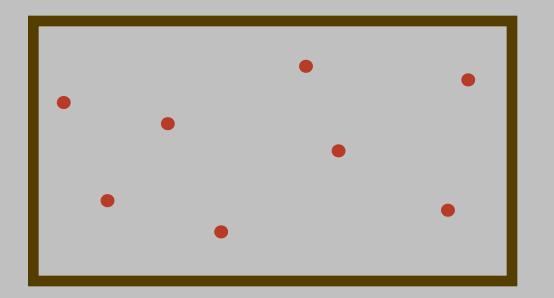
We select:

Let us again make an ideal gas



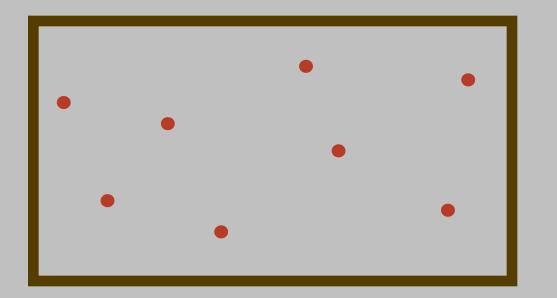
We select: (1) N particles,

Let us again make an ideal gas



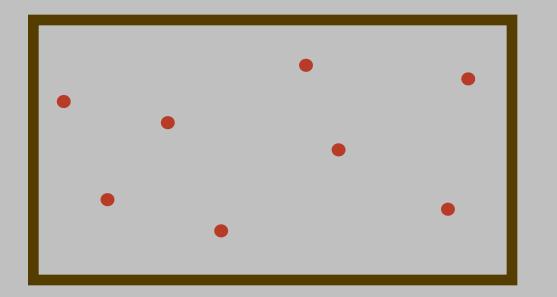
We select: (1) N particles, (2) Volume V,

Let us again make an ideal gas



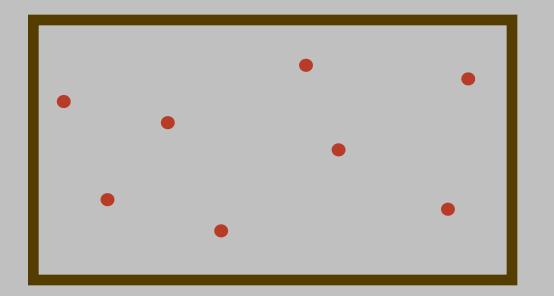
We select: (1) N particles, (2) Volume V, (3) initial velocities

Let us again make an ideal gas



We select: (1) N particles, (2) Volume V, (3) initial velocities + positions

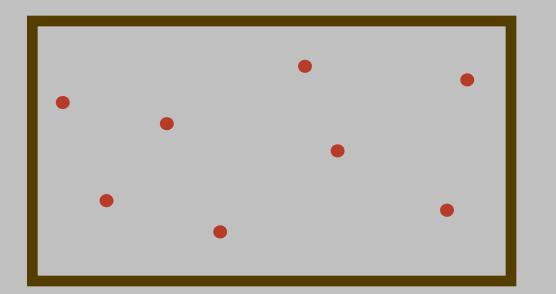
Let us again make an ideal gas



We select: (1) N particles, (2) Volume V, (3) initial velocities + positions

This fixes; V/n, U/n

Let us again make an ideal gas



We select: (1) N particles, (2) Volume V, (3) initial velocities + positions

This fixes; V/n, U/n

Basic assumption

For an isolated system any microscopic configuration is equally likely





The system has the same kinetic energy!!



The system has the same kinetic energy!!

Our basic assumption must be seriously wrong!



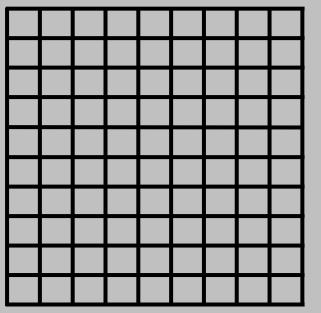
The system has the same kinetic energy!!

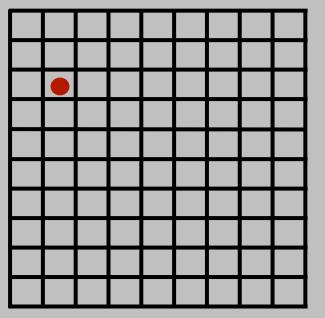
Our basic assumption must be seriously wrong!

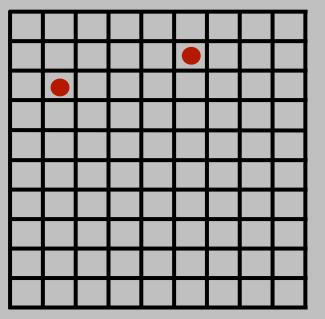
... but are we doing the statistics correctly?

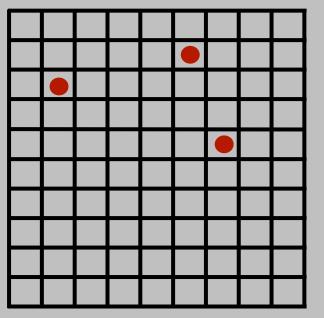
Question

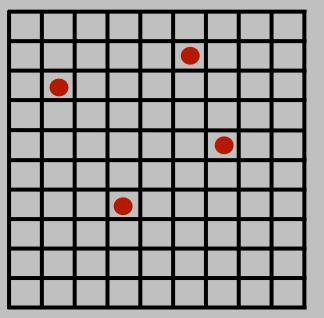
• Is it safe to be in this room?

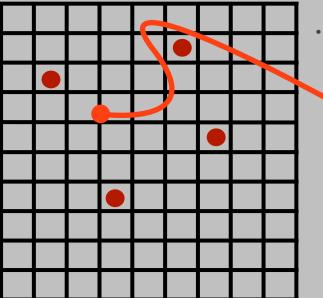




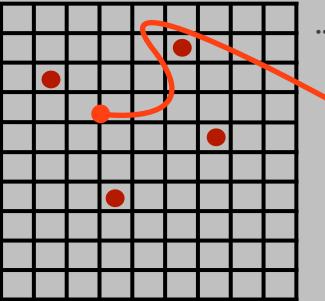








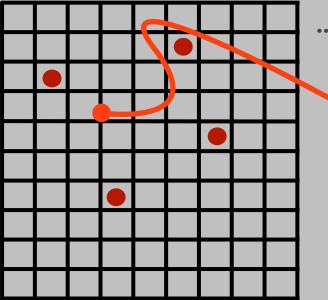
What is the probability to find this configuration?



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Basic

assumption:



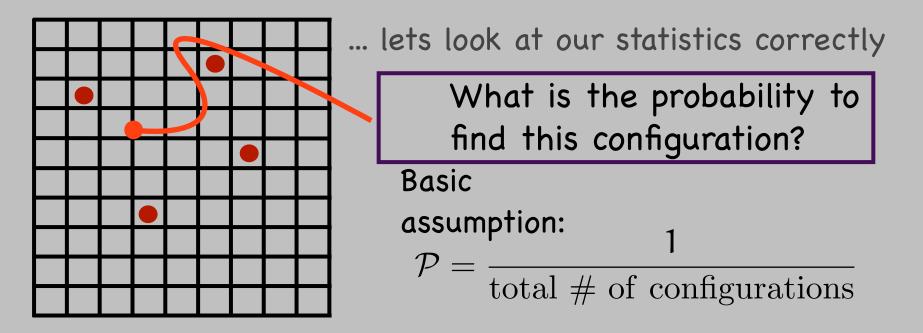
What is the probability to find this configuration?

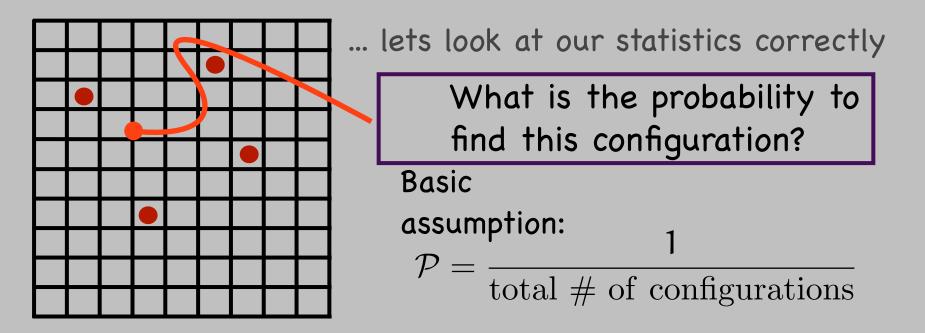
Basic

 \mathcal{P}

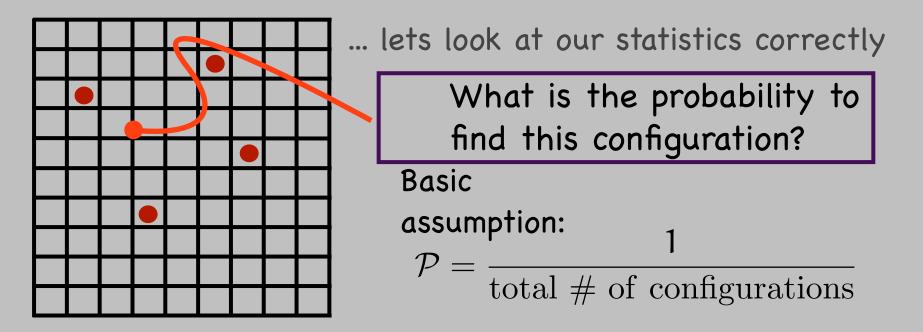
assumption:

$$=\frac{1}{\text{total }\# \text{ of configurations}}$$

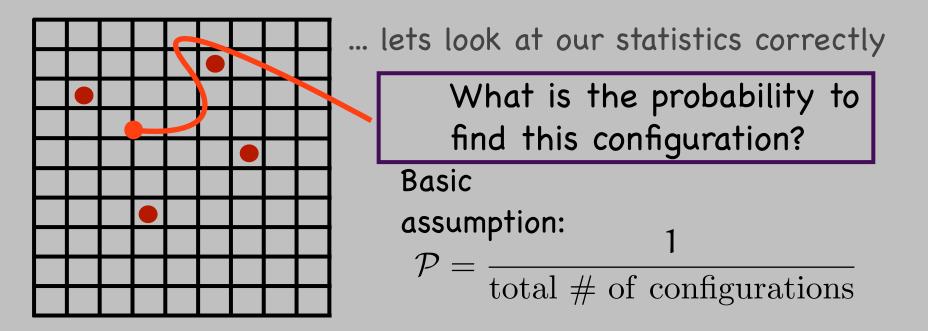




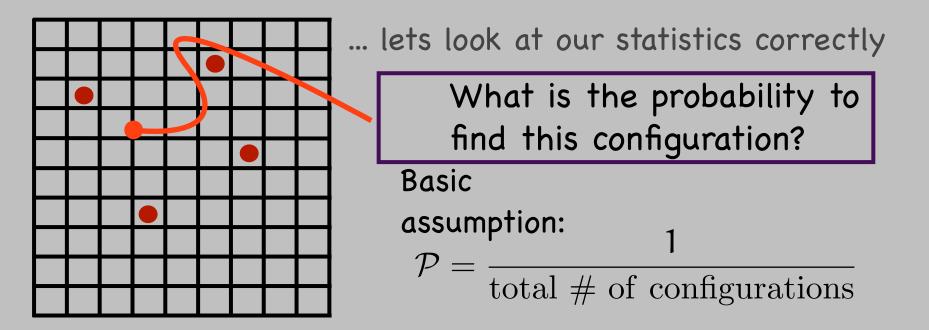
Total number of configurations:



Total number of configurations: M^N

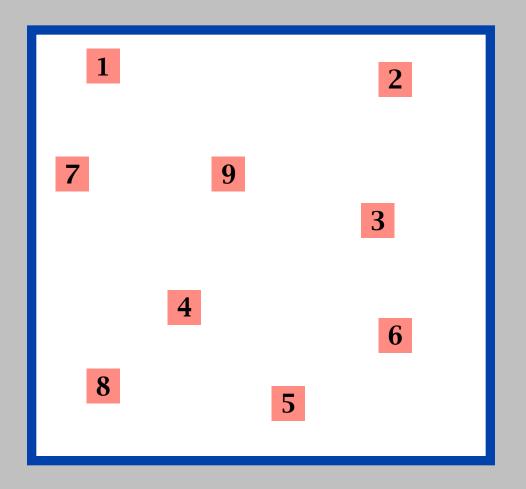


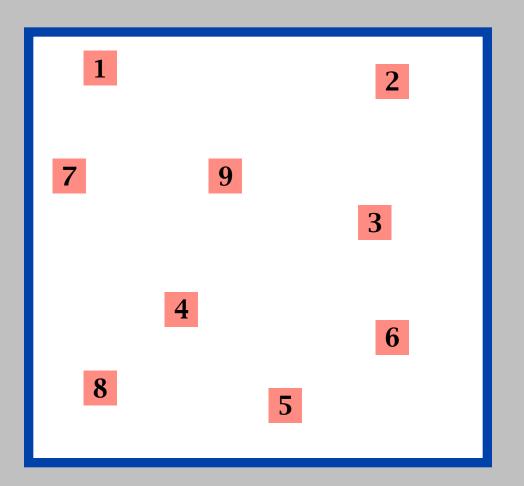
Total number of configurations: M^N with $M = \frac{V}{dr}$

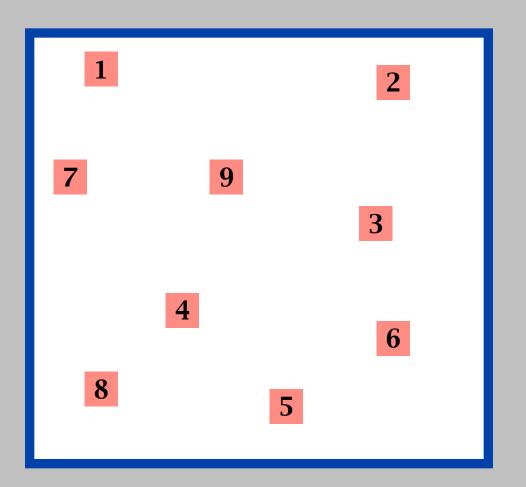


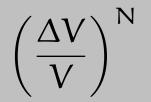
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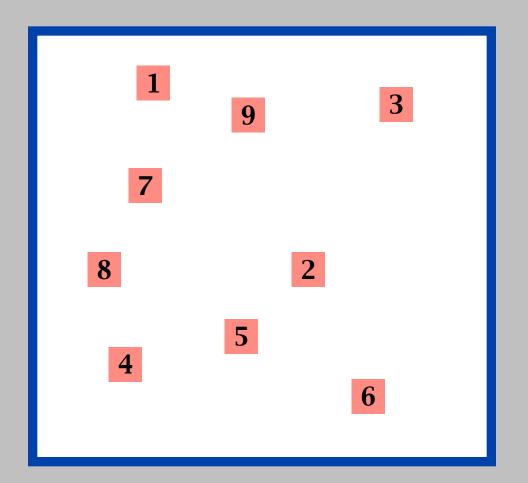
the larger the volume of the gas the more configurations

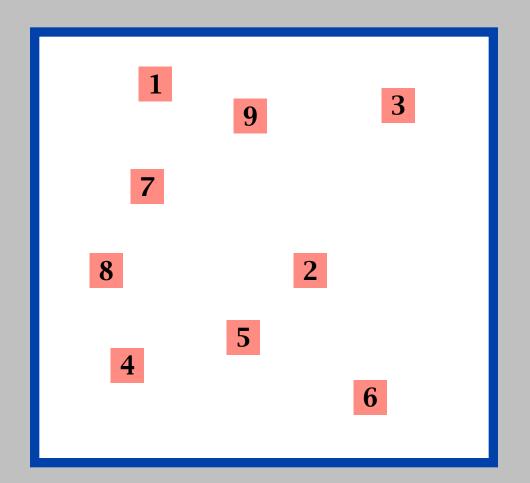


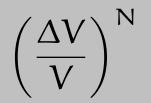


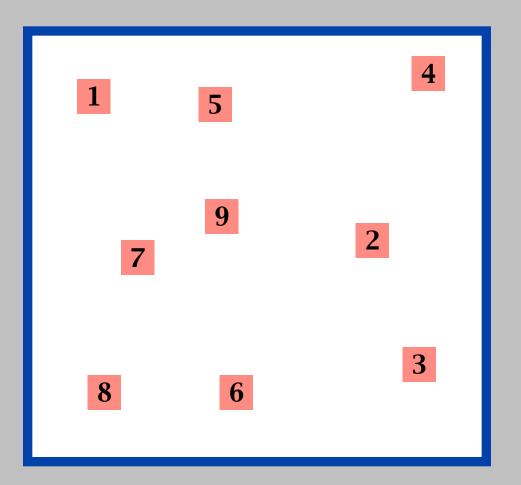


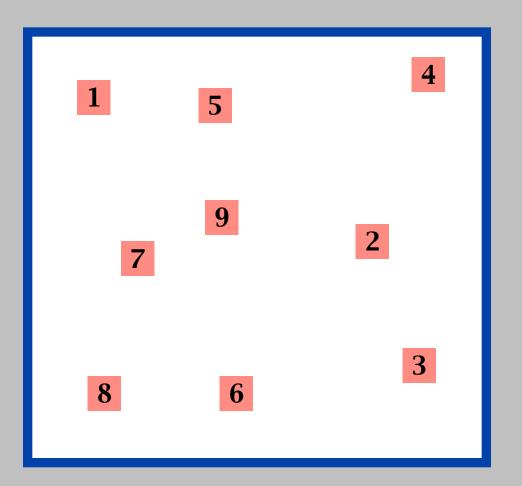


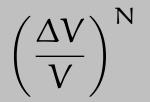


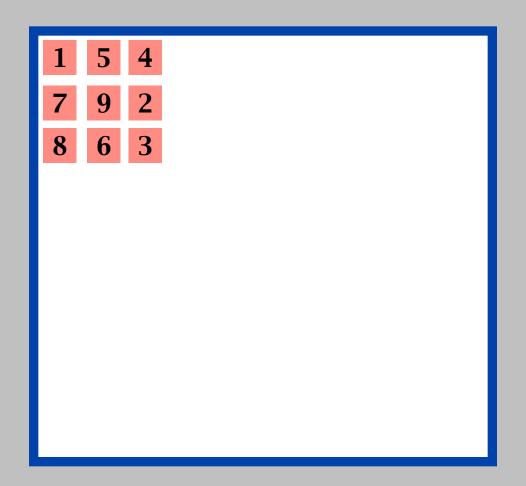


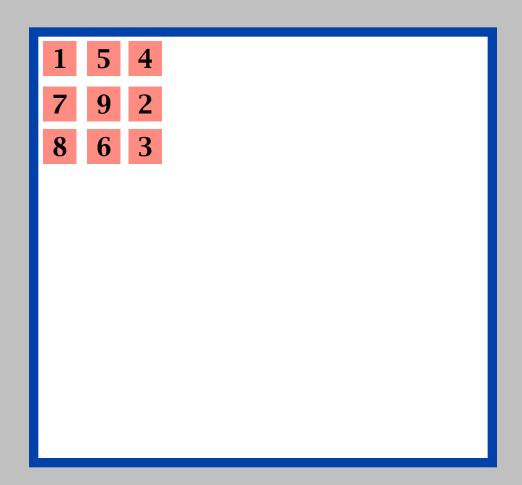


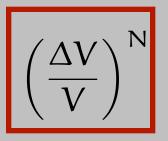


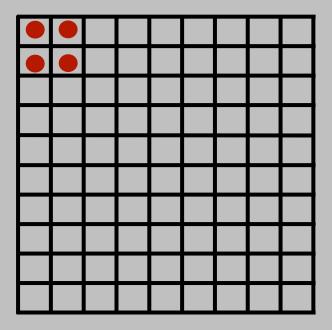


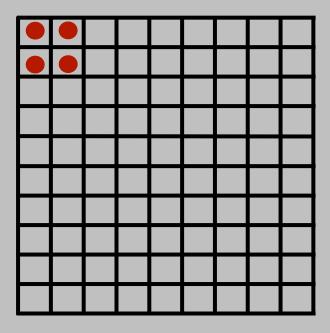




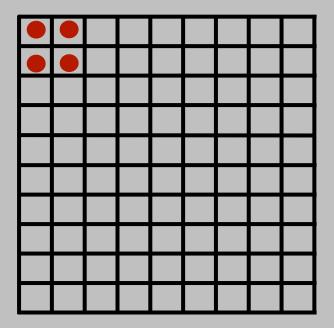






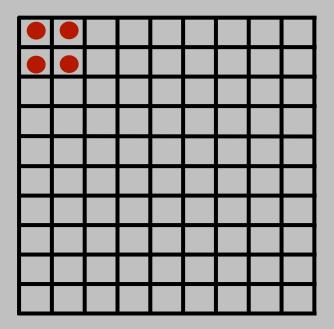


exactly equal as to any other configuration!!!!!!



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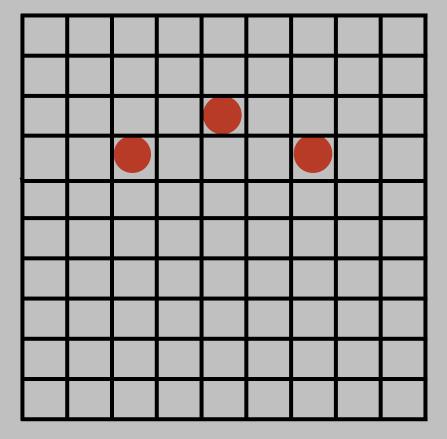
This is reflecting the microscopic reversibility of Newton's equations of motion. A microscopic system has no "sense" of the direction of time



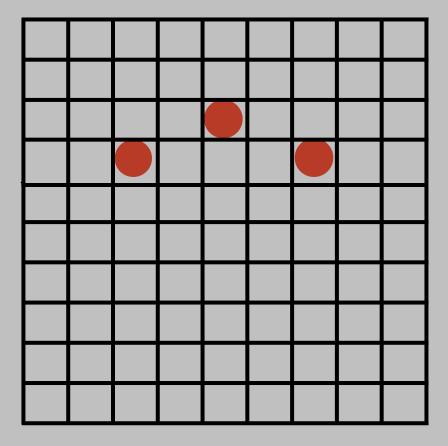
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Are we asking the **right question**?

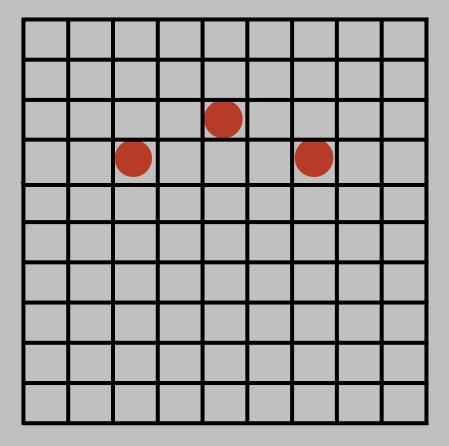


These are microscopic properties; no irreversibility



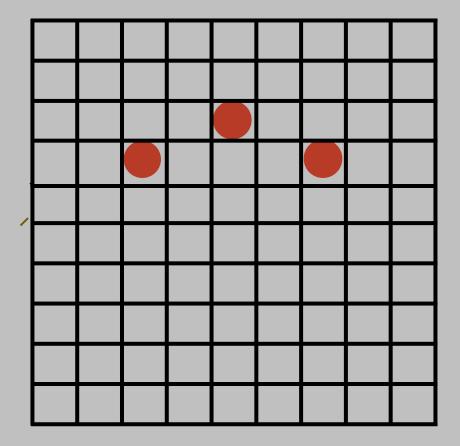
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Thermodynamic is about macroscopic properties:



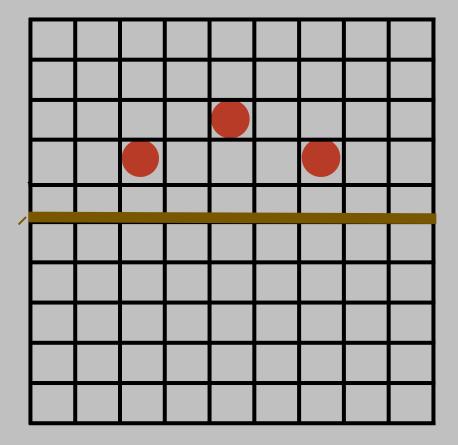
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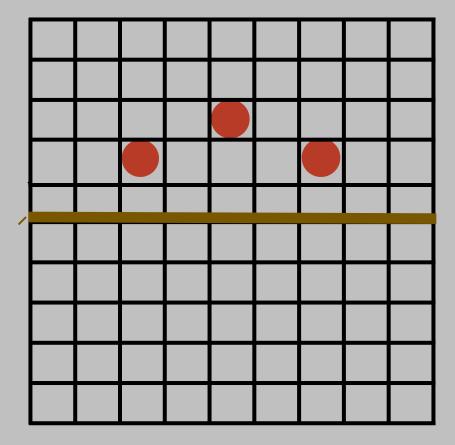
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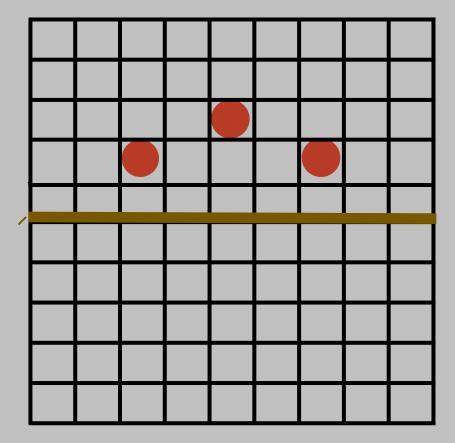
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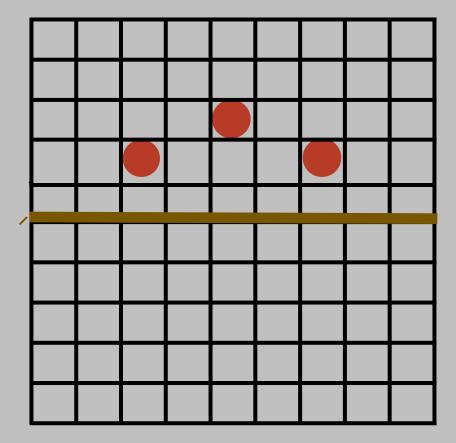
Thermodynamic is about macroscopic properties:



Ν	P(empty)
1	0.5

These are microscopic properties; no irreversibility

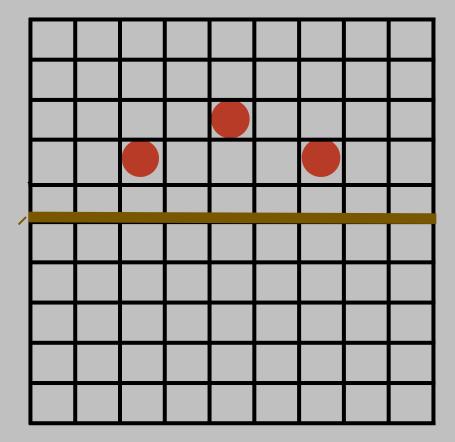
Thermodynamic is about macroscopic properties:



Ν	P(empty)
1	0.5
2	0.5 x 0.5

These are microscopic properties; no irreversibility

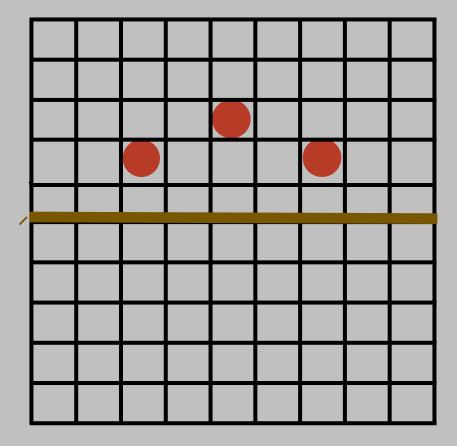
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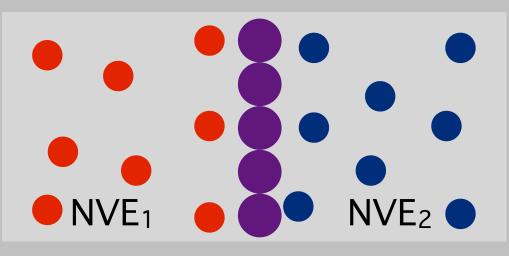
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1000	10 -301

• On a microscopic level all configurations are equally likely

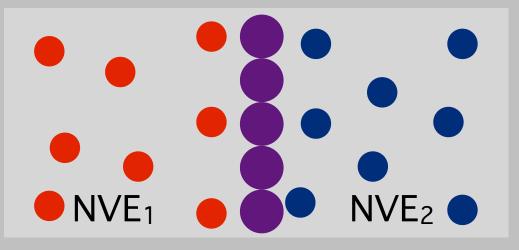
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- On a macroscopic level; as the number of particles is extremely large, the probability that we have a fluctuation from the average value is extremely low
- Let us quantify these statements

 $E_1 > E_2$

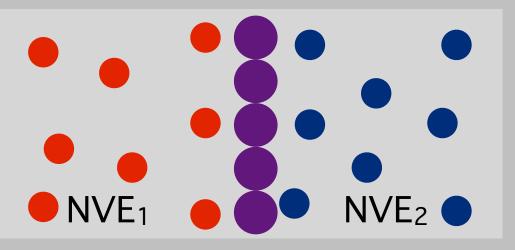


 $E_1 > E_2$



Let us look at one of our examples; let us assume that the total system is isolate but heat can flow between 1 and 2.

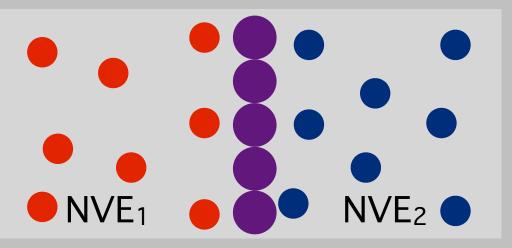
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All micro states will be equally likely!

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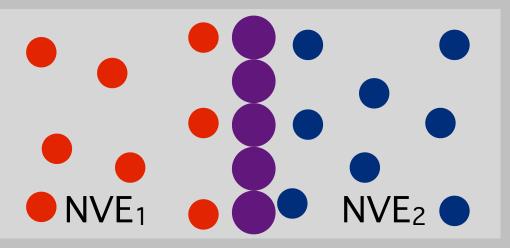


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All micro states will be equally likely!

... but the number of micro states that give an particular energy distribution $(E_1, E-E_1)$ not ...

... so, we observe the most likely one ...

$$\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2) = \frac{\mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}{\sum_{\mathsf{E}_1=0}^{\mathsf{E}_1=\mathsf{E}} \mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}$$

$$\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2) = \frac{\mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}{\sum_{\mathsf{E}_1=0}^{\mathsf{E}_1=\mathsf{E}} \mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}$$

The summation only depends on the total energy:

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The summation only depends on the total energy:

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$$\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2) = \mathsf{C} \times \mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)$$

 $\ln \mathcal{P}(\mathsf{E}_1,\mathsf{E}_2) = \ln C + \ln \mathcal{N}_1(\mathsf{E}_1) + \ln \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)$

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We need to find the maximum

$$\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2) = \frac{\mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}{\sum_{\mathsf{E}_1=0}^{\mathsf{E}_1=\mathsf{E}} \mathcal{N}_1(\mathsf{E}_1) \times \mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)}$$

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$$\frac{\mathrm{d}\ln\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2)}{\mathrm{d}\mathsf{E}_1} = \frac{\mathrm{d}\ln\mathcal{N}(\mathsf{E}_1,\mathsf{E}_2)}{\mathrm{d}\mathsf{E}_1} = 0$$

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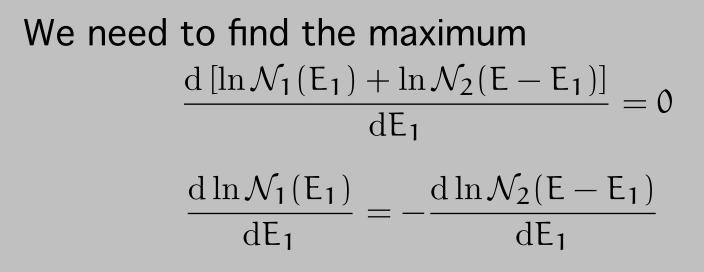
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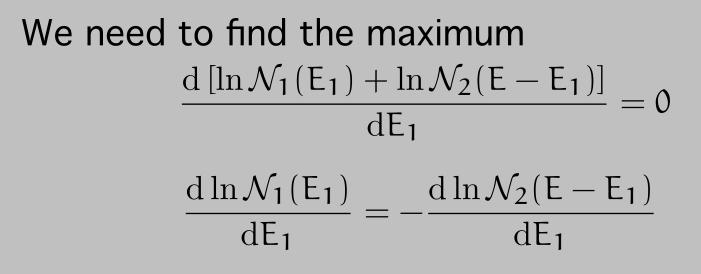
$$\frac{\mathrm{d}\ln\mathcal{P}(\mathsf{E}_1,\mathsf{E}_2)}{\mathrm{d}\mathsf{E}_1} = \frac{\mathrm{d}\ln\mathcal{N}(\mathsf{E}_1,\mathsf{E}_2)}{\mathrm{d}\mathsf{E}_1} = 0$$
$$\frac{\mathrm{d}\left[\ln\mathcal{N}_1(\mathsf{E}_1) + \ln\mathcal{N}_2(\mathsf{E}-\mathsf{E}_1)\right]}{\mathrm{d}\mathsf{E}_1} = 0$$

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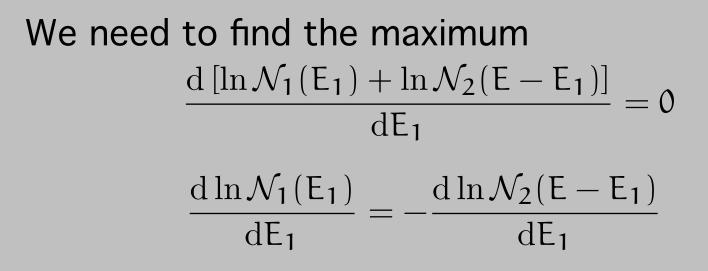


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 $dE_1 = -d(E - E_1) = -dE_2$

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As the total energy is constant

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Which gives as equilibrium condition:

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Equilibrium if: $\frac{d \ln \mathfrak{N}_1(E_1)}{dE_1} = \frac{d \ln \mathfrak{N}_2(E_2)}{dE_2}$

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And for the total system: $S^* = S_1^* + S_2^*$

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For a system at constant energy, volume and number of particles the S^* increases until it has reached its maximum value at equilibrium

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For a system at constant energy, volume and number of particles the S^* increases until it has reached its maximum value at equilibrium

What is this magic property S*?

$$S^{*}(E_{1}, E - E_{1}) = \ln \aleph(E_{1}, E - E_{1})$$

= $\ln \aleph_{1}(E_{1}) + \ln \aleph_{2}(E - E_{1})$
= $S_{1}^{*}(E_{1}) + S_{2}^{*}(E - E_{1})$

$$S^{*}(E_{1}, E - E_{1}) = \ln \aleph(E_{1}, E - E_{1})$$

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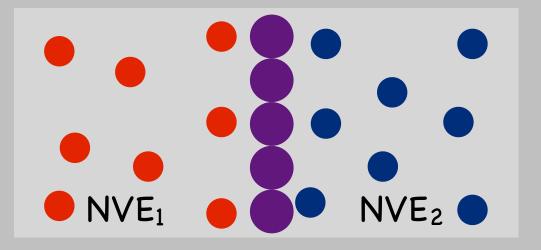
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Why is S^{*} not quite entropy?

Units! The logarithm is just a unitless quantity.

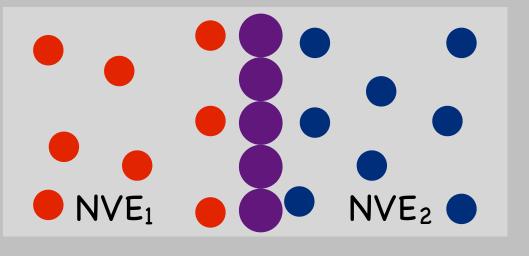
Thermal Equilibrium (Review)



 $E_1 > E_2$

Isolated system that allows heat flow between 1 and 2.

Thermal Equilibrium (Review)

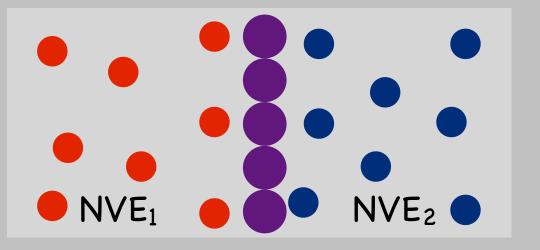


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Isolated system that allows heat flow between 1 and 2.

$\aleph(E_1, E - E_1) = \aleph_1(E_1) \cdot \aleph_2(E - E_1)$

Thermal Equilibrium (Review)



 $E_1 > E_2$

Isolated system that allows heat flow between 1 and 2.

$$\aleph(E_1, E - E_1) = \aleph_1(E_1) \bullet \aleph_2(E - E_1)$$

Number of micro states that give an particular energy distribution $(E_1, E-E_1)$ is maximized with respect to E_1 .

$$\left(\frac{\partial S_1^*}{\partial E_1}\right)_{N_1,V_1} = \left(\frac{\partial S_2^*}{\partial E_2}\right)_{N_2,V_2}$$

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$$\mathrm{d}E = T\mathrm{d}S\text{-}p\mathrm{d}V + \sum_{i=1}^{M} \mu_i \mathrm{d}N_i$$

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Temperature

$$\left(\frac{\partial S_1^*}{\partial E_1}\right)_{N_1,V_1} = \left(\frac{\partial S_2^*}{\partial E_2}\right)_{N_2,V_2}$$

What do these partial derivatives relate to?

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$$dE = TdS - pdV + \sum_{i=1}^{M} \mu_i dN_i$$
$$T = \left(\frac{\partial E}{\partial S}\right)_{V,N_i} \text{ or } \frac{1}{T} = \left(\frac{\partial S}{\partial E}\right)_{V,N_i}$$

Temperature

Summary

- Statistical Mechanics:
 - basic assumption:
 - all microstates are equally likely
 - Applied to NVE
 - Definition of Entropy: $S = k_B \ln \Omega$
 - Equilibrium: equal temperatures

How large is Ω for a glass of water?

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$$\Omega \approx 10^{2 \times 10^{23}}$$

• Macroscopic deviations from the second law of thermodynamics are not forbidden, but they are extremely unlikely.

MOLECULAR SINULATION From Algorithms to Applications

secon

Systems at Constant Temperature (different ensembles)

Daan Frenkel & Berend Smit

The 2nd law

The 2nd law

Entropy of an <u>isolated system</u> can only increase; until equilibrium were it takes its maximum value

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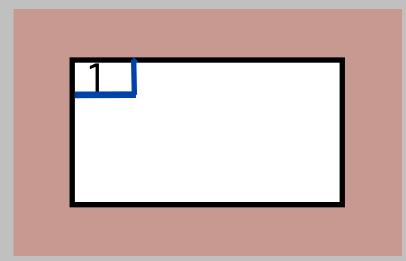
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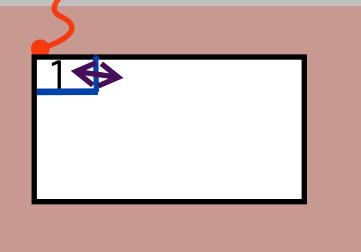
What is the formulation for these systems?

Constant T and V



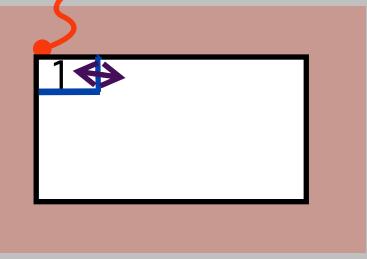
Constant T and V

We have our box 1 and a bath



Constant T and V

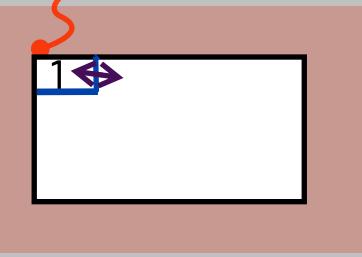
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<u>Total system</u> is isolated and the volume is constant

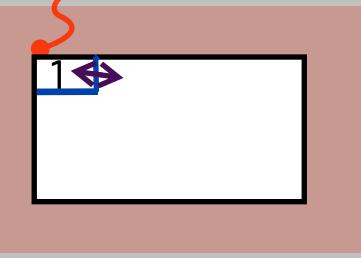


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First law

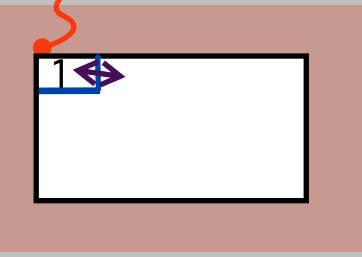


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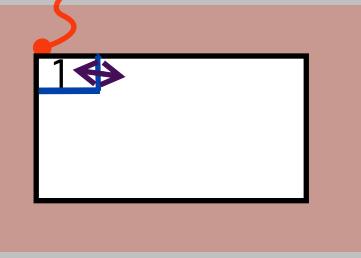


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Constant T and V

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First law dU = dq - pdV = 0Second law $dS \ge 0$



Constant T and V

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<u>Total system</u> is isolated and the volume is constant

 $\begin{array}{ll} \mbox{First law} & \mathrm{d} U = \mathrm{d} q - p \mathrm{d} V = 0 \\ \mbox{Second law} & \mathrm{d} S \geq 0 \end{array}$

Box 1: constant volume and temperature



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1st law:



Constant T and V

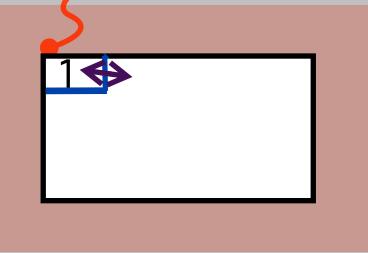
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<u>Total system</u> is isolated and the volume is constant

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Box 1: constant volume and temperature

1st law: $dU_1 + dU_b = 0$



Constant T and V

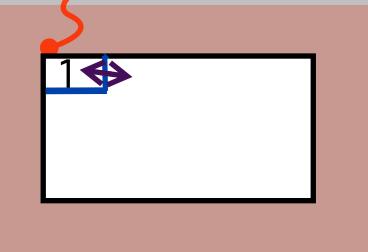
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1st law: $dU_1 + dU_b = 0$ or



Constant T and V

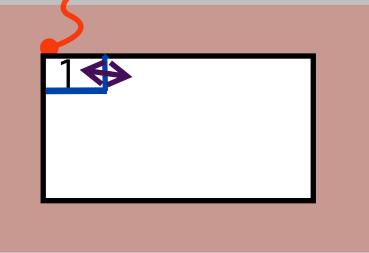
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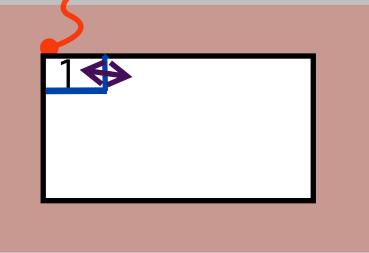
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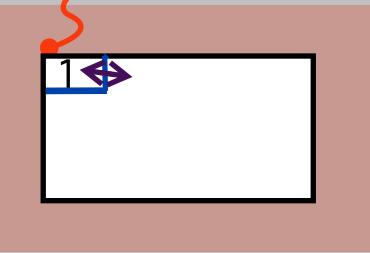
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2nd law:



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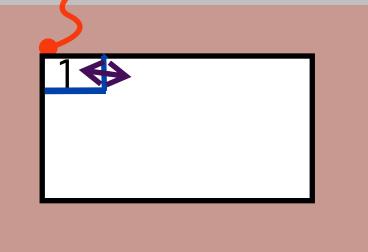
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2nd law:
$$dS_1 + dS_b = dS_1 + \frac{dU_b}{T} \ge 0$$



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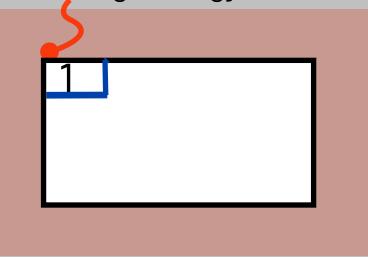
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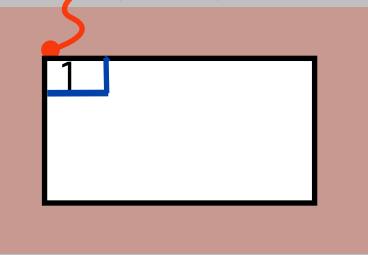
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$$\begin{array}{ll} \text{2^{nd} law:} & \mathrm{d}S_1 + \mathrm{d}S_b = \mathrm{d}S_1 + \frac{\mathrm{d}U_b}{T} \geq 0\\ & T\mathrm{d}S_1 - \mathrm{d}U_1 \geq 0 \end{array}$$



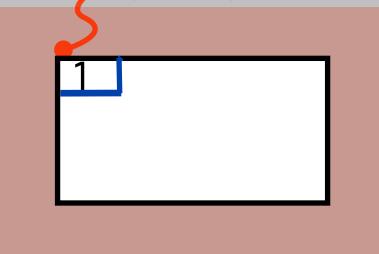
Constant T and V

Total system is isolated and the volume is constant Box 1: constant volume and temperature 2^{nd} law: $TdS_1 - dU_1 \ge 0$



Constant T and V

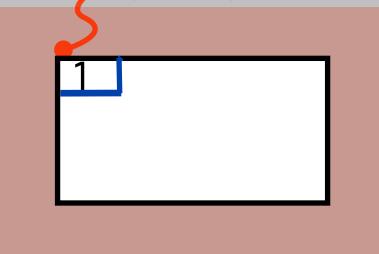
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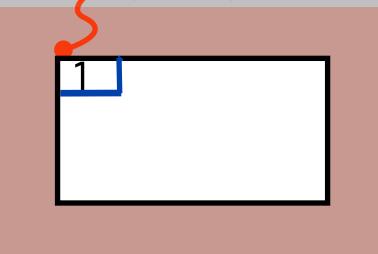
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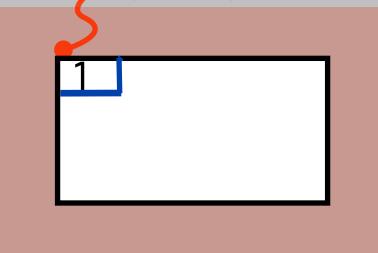
 $A \equiv U - TS$



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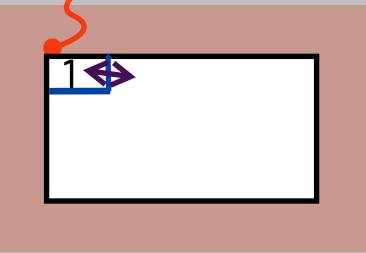
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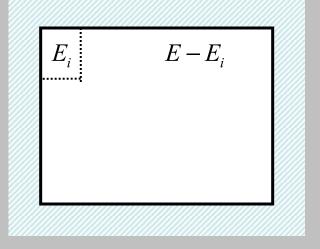
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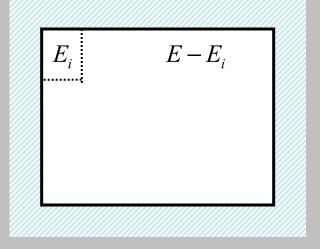
 $A \equiv U - TS$

For box 1 we can write $dA_1 < 0$

Hence, for a system at constant temperature and volume the <u>Helmholtz free energy</u> decreases and takes its minimum value at equilibrium

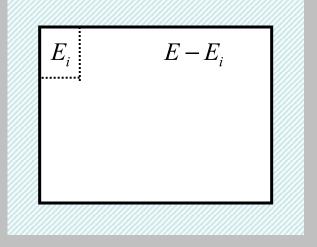


Consider a small system that can exchange heat with a big reservoir



Consider a small system that can exchange heat with a big reservoir

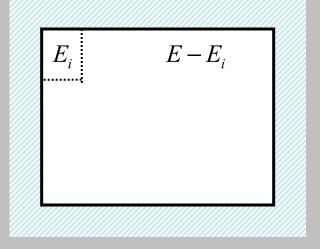
$$\ln \Omega \left(E - E_i \right) = \ln \Omega \left(E \right) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$



Consider a small system that can 2xchange heat with a big reservoir

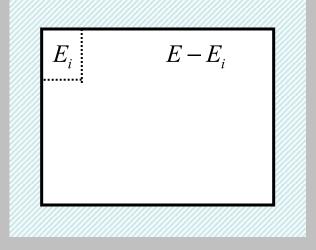
 $1/k_BT$

$$\ln \Omega \left(E - E_i \right) = \ln \Omega \left(E \right) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$



Consider a small system that can exchange heat with a big reservoir

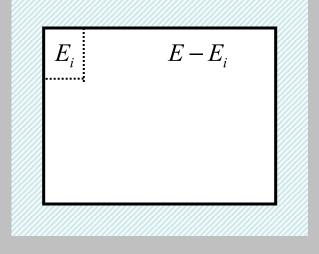
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Consider a small system that can exchange heat with a big reservoir

$$\ln \Omega (E - E_i) = \ln \Omega (E) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$

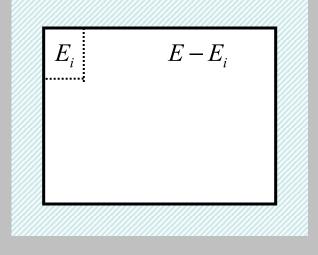
$$\ln \frac{\Omega(E-E_i)}{\Omega(E)} = -\frac{E_i}{k_B T}$$



Consider a small system that can exchange heat with a big reservoir

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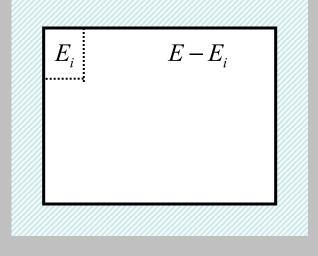


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$$\ln \Omega (E - E_i) = \ln \Omega (E) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$

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$$P(E_i) = \frac{\Omega(E - E_i)}{\sum_{j} \Omega(E - E_j)} = \frac{\exp(-E_i/k_B T)}{\sum_{j} \exp(-E_j/k_B T)}$$

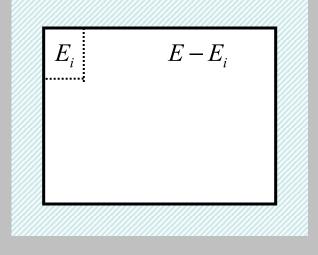


Consider a small system that can exchange heat with a big reservoir

$$\ln \Omega (E - E_i) = \ln \Omega (E) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$

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$$P(E_i) = \frac{\Omega(E - E_i)}{\sum_j \Omega(E - E_j)} = \frac{\exp(-E_i/k_B T)}{\sum_j \exp(-E_j/k_B T)}$$
$$P(E_i) \propto \exp(-E_i/k_B T)$$



Consider a small system that can exchange heat with a big reservoir

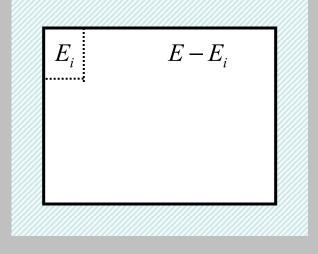
$$\ln \Omega (E - E_i) = \ln \Omega (E) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$

$$\ln \frac{\Omega(E-E_i)}{\Omega(E)} = -\frac{E_i}{k_B T}$$

Hence, the probability to find E_i :

$$P(E_{i}) = \frac{\Omega(E - E_{i})}{\sum_{j} \Omega(E - E_{j})} = \frac{\exp(-E_{i}/k_{B}T)}{\sum_{j} \exp(-E_{j}/k_{B}T)}$$
$$P(E_{i}) \propto \exp(-E_{i}/k_{B}T)$$
Boltzmann distribution

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Consider a small system that can exchange heat with a big reservoir

$$\ln \Omega (E - E_i) = \ln \Omega (E) - \frac{\partial \ln \Omega}{\partial E} E_i + \cdots$$

$$\ln \frac{\Omega(E-E_i)}{\Omega(E)} = -\frac{E_i}{k_B T}$$

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$$P(E_{i}) \propto \exp(-E_{i}/k_{B}T)$$
Solution Boltzmann distribution

Thermodynamics

What is the average energy of the system?

$$\langle E \rangle \equiv \sum_{i} E_{i} P(E_{i}) = \frac{\sum_{i} E_{i} \exp(-\beta E_{i})}{\sum_{j} \exp(-\beta E_{j})}$$

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$$= -\frac{\partial \ln \sum_{i} \exp(-\beta E_{i})}{\partial \beta}$$

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$$\langle E \rangle \equiv \sum_{i} E_{i} P(E_{i}) = \frac{\sum_{i} E_{i} \exp(-\beta E_{i})}{\sum_{j} \exp(-\beta E_{j})}$$
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$$= -\frac{\partial \ln Q_{N,V,T}}{\partial \beta}$$
Compare:

$$\left(\frac{\partial F/T}{\partial 1/T}\right) = E$$

First law of thermodynamics

 $\mathrm{d}E = T\mathrm{d}S - p\mathrm{d}V$

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Thermodynamics First law of thermodynamics dE = TdS - pdVHelmholtz Free energy: $F \equiv E - TS$ $\mathrm{d}F = -S\mathrm{d}T - p\mathrm{d}V$ $\left(\frac{\partial F/T}{\partial 1/T}\right) = F + \frac{1}{T} \frac{\partial F}{\partial 1/T} = F - T \frac{\partial F}{\partial T}$ = F + TS = E

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$$\left(\frac{\partial F/T}{\partial 1/T}\right) = E$$
Hence:
$$\frac{F}{k_{B}T} = -\ln Q_{N,V,T}$$

We have assumed that we can count states

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What to do for classical model such as an ideal gas, hard spheres, Lennard-Jones?

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Energy is continue:

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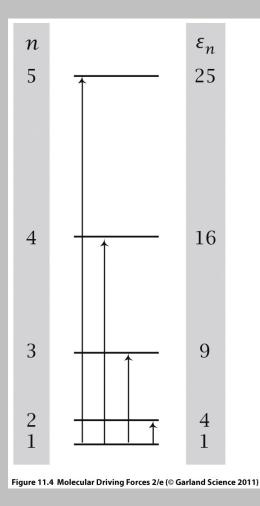
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What are the energy levels for Argon in a 1-dimensional box of 1 cm?

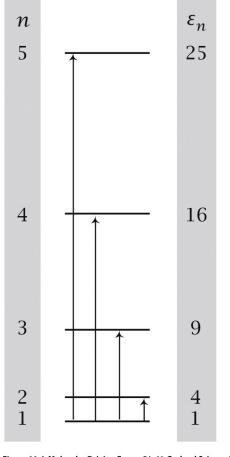
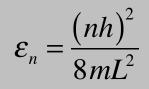


Figure 11.4 Molecular Driving Forces 2/e (© Garland Science 2011)



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Argon: m=40 g/mol= 6.63×10^{-26} kg h= 6.63×10^{-34} J s

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$$q_{translational} = \int_{0}^{\infty} e^{-\frac{(m)}{8mL^{2}k_{B}T}} dn \qquad q_{translational}$$
3D:
$$q_{translational} = \left(\frac{2\pi mk_{B}T}{h^{2}}\right)^{\frac{3}{2}} V = \frac{V}{\Lambda^{3}}$$

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De Broglie
wavelength

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$$q = \sum_{n=1}^{\infty} e^{-E_n} = \int e^{-E_n} dn$$

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Configurational part of the partition function:

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Configurational part of the partition function:

$$Q_{N,V,T} = \frac{1}{\Lambda^{3N} N!} \int e^{-\frac{U(r)}{k_B T}} dr^N$$

Question

- For an ideal gas, calculate:
 - the partition function
 - the pressure
 - the energy
 - the chemical potential

$$Q_{N,V,T}^{IG} = \frac{V^N}{\Lambda^{3N} N!}$$

All thermodynamics follows from the partition function!

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$$F^{IG} = -k_B T \ln Q_{N,V,T}^{IG} = k_B T N \left[\ln \Lambda^3 - \ln \left(V/N \right) \right]$$

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Pressure: $p = -\left(\frac{\partial F}{\partial V}\right)_{T,N} = k_B T N \frac{1}{V}$
Energy: $E = \left(\frac{\partial F/T}{\partial 1/T}\right)_{V,N} = 3k_B N \left(\frac{\partial \ln \Lambda}{\partial 1/T}\right)_{V,N}$

$$Q_{N,V,T}^{IG} = \frac{V^N}{\Lambda^{3N} N!}$$

 $\frac{1}{2}$

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 $E = \frac{3}{2} N k_B T$ $\Lambda = \left(\frac{h^2}{2\pi m k_B T}\right)^2$

2

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 $\beta\mu^{IG} = \beta\mu^0 + \ln\rho$

Summary: Canonical ensemble (*N*,*V*,*T*)

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$$P(\Gamma) \propto \exp\left[-\beta U(\Gamma)\right]$$

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$$\beta F = -\ln Q_{N,V,T}$$

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$$Q(N,V,E) = \frac{1}{h^{3N}N!} \iint d\mathbf{p}^N d\mathbf{r}^N \delta\left(H\left(\mathbf{p}^N,\mathbf{r}^N\right) - E\right)$$

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$$\beta S = \ln Q_{N,V,E}$$

MOLECULAR SINULATION From Algorithms to Applications

second

Other Ensemble

Daan Frenkel & Berend Smit

Other ensembles?

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COURSE: MD and MC different ensembles

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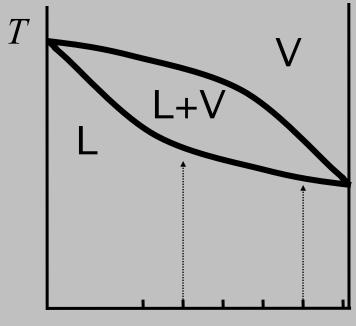
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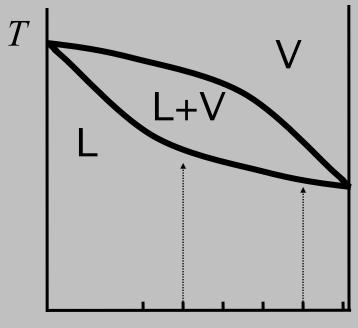
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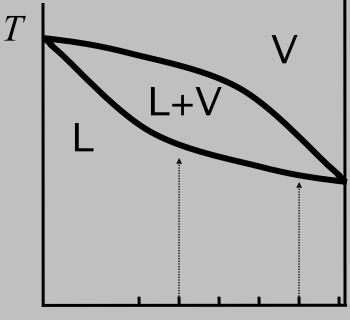


composition



Measure the composition of the coexisting vapour and liquid phases if we start with a homogeneous liquid of two different compositions:

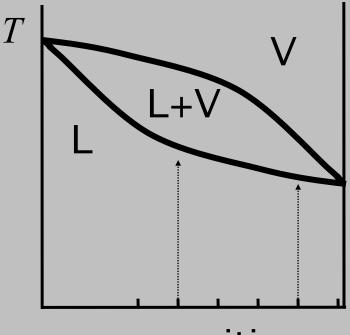
composition



Measure the composition of the coexisting vapour and liquid phases if we start with a homogeneous liquid of two different compositions:

• How to mimic this with the N,V,T ensemble?

composition

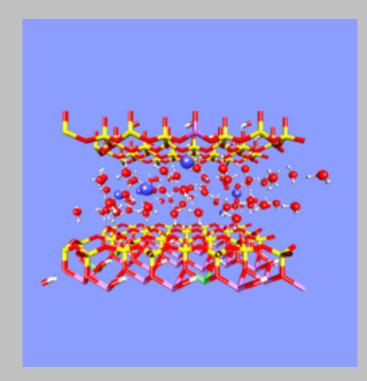


composition

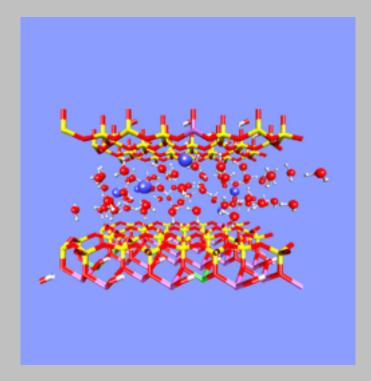
Measure the composition of the coexisting vapour and liquid phases if we start with a homogeneous liquid of two different compositions:

- How to mimic this with the N,V,T ensemble?
- What is a better ensemble?

Example (2): swelling of clays



Example (2): swelling of clays



Deep in the earth clay layers can swell upon adsorption of water:

- How to mimic this in the N,V,T ensemble?
- What is a better ensemble to use?

Ensembles

Ensembles

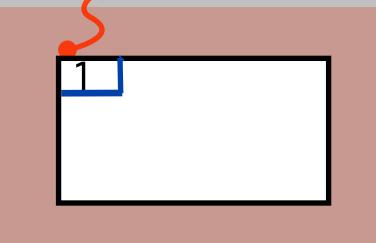
- Micro-canonical ensemble: *E*,*V*,*N*
- Canonical ensemble: *T*,*V*,*N*
- Constant pressure ensemble: *T,P,N*
- Grand-canonical ensemble: *T*, *V*, *µ*

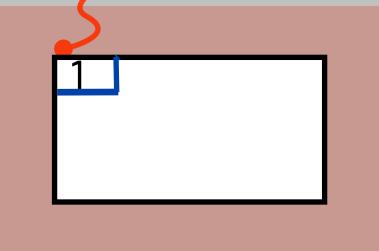
MOLECULAR SINULATION From Algorithms to Applications

secon

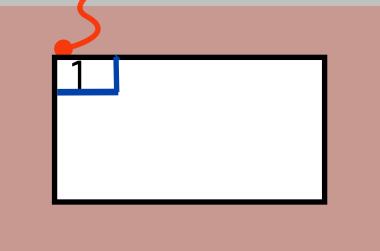
Constant pressure

Daan Frenkel & Berend Smit

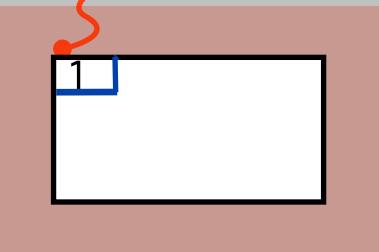




We have our box 1 and a bath

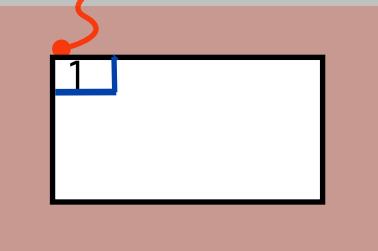


We have our box 1 and a bath <u>Total system</u> is isolated and the volume is constant

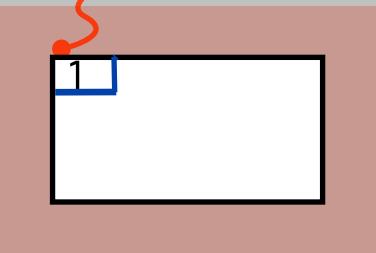


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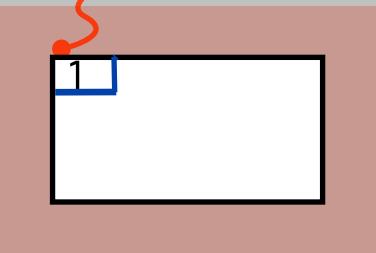
First law



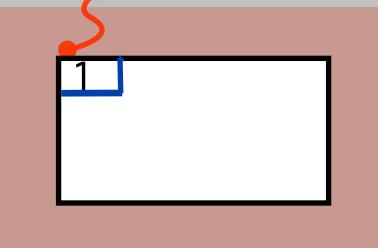
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We have our box 1 and a bath <u>Total system</u> is isolated and the volume is constant First law dU = dq - pdV = 0Second law

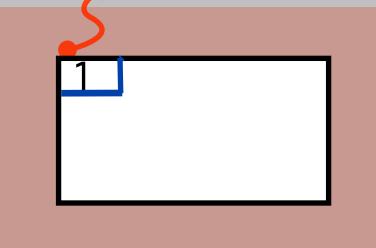


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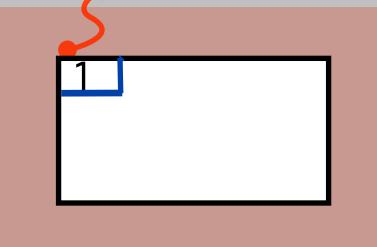
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Box 1: constant pressure and temperature



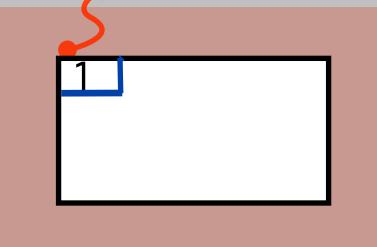
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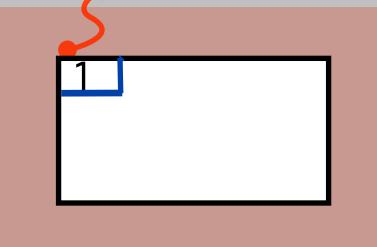


We have our box 1 and a bath <u>Total system</u> is isolated and the volume is constant First law dU = dq - pdV = 0Second law $dS \ge 0$

Box 1: constant pressure and temperature 1^{st} law: $dU_1 + dU_b = 0$

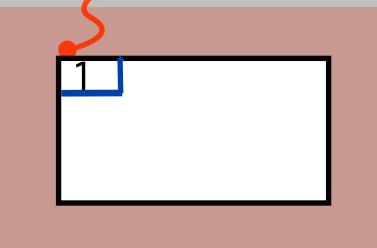


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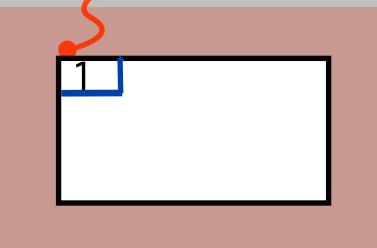
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1st law: $dU_1 + dU_b = 0$ or $dU_1 = -dU_b$



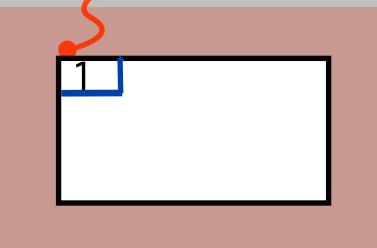
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$$\begin{array}{ll} \mbox{1}^{st} \mbox{ law:} & \mbox{d} U_1 + \mbox{d} U_b = 0 & \mbox{or} & \mbox{d} U_1 = -\mbox{d} U_b \\ & \mbox{d} V_1 + \mbox{d} V_b = 0 & \end{array}$$



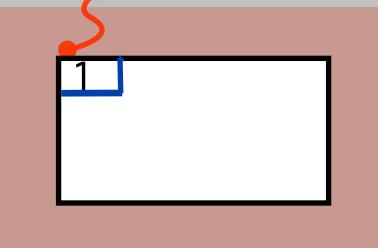
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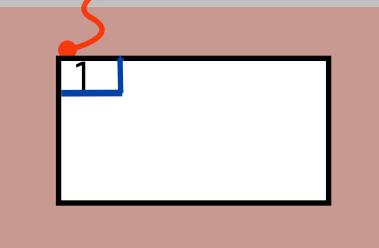
<u>Total system</u> is isolated and the volume is constant

First law dU = dq - pdV = 0

Second law $dS \ge 0$

Box 1: constant pressure and temperature

1st law: $dU_1 + dU_b = 0$ or $dU_1 = -dU_b$ $dV_1 + dV_b = 0$ or $dV_1 = -dV_b$ The bath is very large and the small changes do not change P or T; in addition the process is reversible



We have our box 1 and a bath

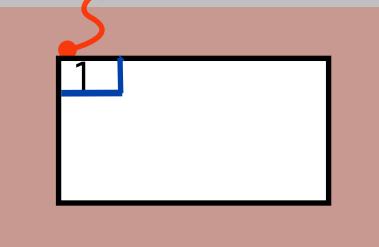
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2nd law:



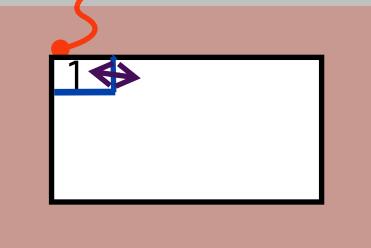
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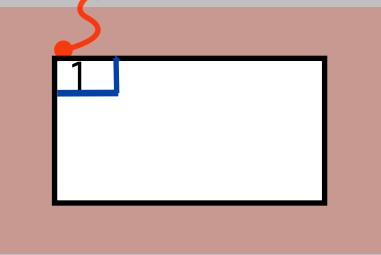
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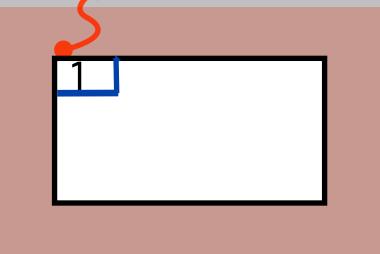
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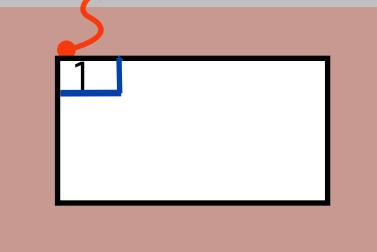
Box 1: constant pressure and temperature



<u>Total system</u> is isolated and the volume is constant <u>Box 1</u>: constant pressure and temperature 2^{nd} law: $TdS_1 - dU_1 - pdV_1 \ge 0$

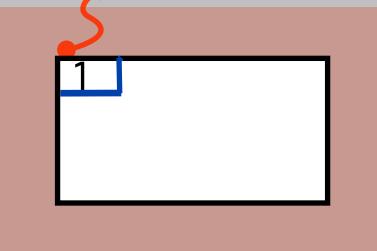


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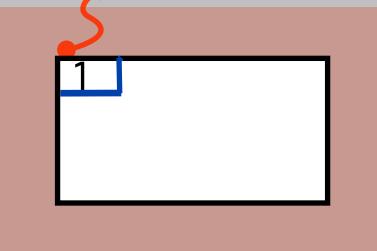
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Let us define the **Gibbs free energy**: G



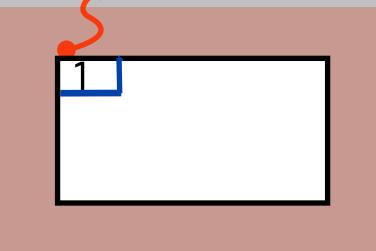
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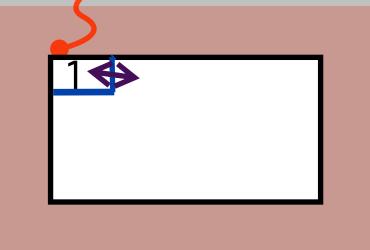
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Total system is isolated and the volume is constant Box 1: constant pressure and temperature 2^{nd} law: $TdS_1 - dU_1 - pdV_1 \ge 0$ $d(\mathbf{U}_1 - \mathsf{T}S_1 + \mathfrak{p}V_1) < 0$ $G \equiv U - TS + pV$ $\mathrm{d}G_1 < 0$



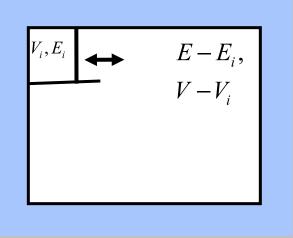
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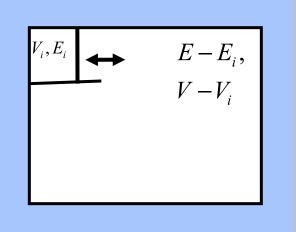
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For box 1 we can write $dG_1 \leq 0$

Hence, for a system at constant temperature and pressure the <u>Gibbs free energy</u> decreases and takes its minimum value at equilibrium

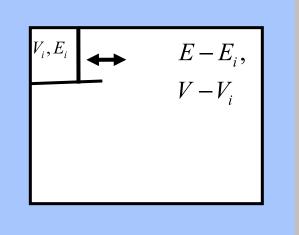


Consider a small system that can exchange volume and energy with a big reservoir



Consider a small system that can exchange volume and energy with a big reservoir

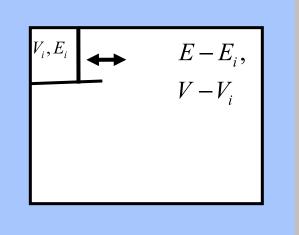
$$\ln \Omega \left(V - V_{i,E} - E_{i} \right) = \ln \Omega \left(V, E \right) - \left(\frac{\partial \ln \Omega}{\partial E} \right)_{V} E_{i} - \left(\frac{\partial \ln \Omega}{\partial V} \right)_{E} V_{i} + \cdots$$



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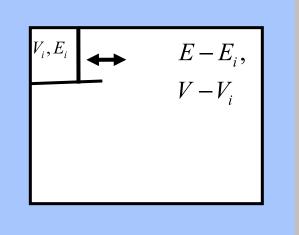
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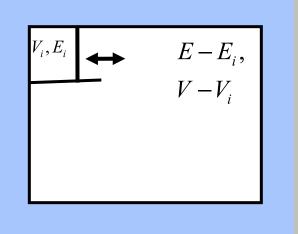


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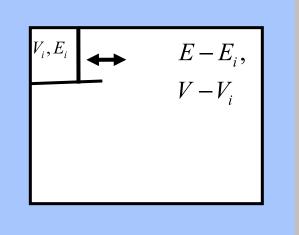


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$$dS = \frac{1}{T}dU + \frac{p}{T}dV - \sum \frac{\mu_i}{T}dN_i$$



Consider a small system that can exchange volume and energy with a big reservoir

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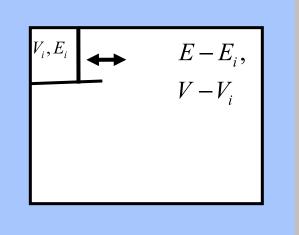
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Ι

$$\left(\frac{\partial S}{\partial U}\right)_{V,N_i} = \frac{1}{T}$$

d



Consider a small system that can exchange volume and energy with a big reservoir

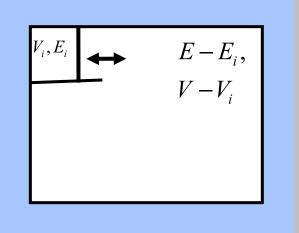
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Hence, the probability to find E_i, V_i :

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$$P(E_{i},V_{i}) = \frac{\Omega(E-E_{i},V-V_{i})}{\sum_{j,k}\Omega(E-E_{j},V-V_{k})} = \frac{\exp[-\beta(E_{i}+pV_{i})]}{\sum_{j,k}\exp[-\beta(E_{j}+pV_{k})]}$$

\$\approx \exp[-\beta(E_{i}+pV_{i})]\$

Partition function:

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Hence:

Summary

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$$Q(N,P,T) = \frac{1}{\Lambda^{3N} N!} \int dV \exp(-\beta PV) \int d\mathbf{r}^N \exp\left[-\beta U(\mathbf{r}^N)\right]$$

Summary

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The probability to find a particular \mathbf{r}^{N}, V configuration:

$$P(\mathbf{r}^{N}, V) \propto \exp\left[-\beta \left(PV + U(r^{N})\right)\right]$$

MOLECULAR SINULATION From Algorithms to Applications

secon

grand-canonical ensemble

Daan Frenkel & Berend Smit

Grand-canonical ensemble

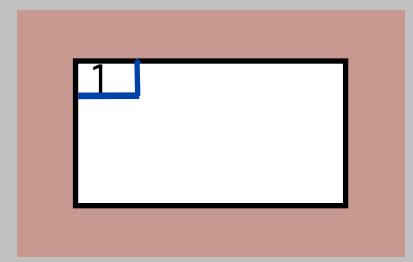
Classical

• A small system that can exchange heat and particles with a large bath

Statistical

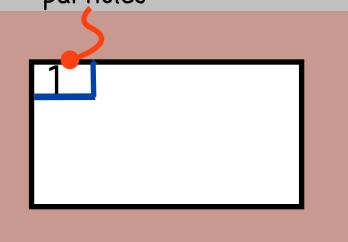
• Taylor expansion of a small reservoir

Constant T and μ



exchange energy and particles

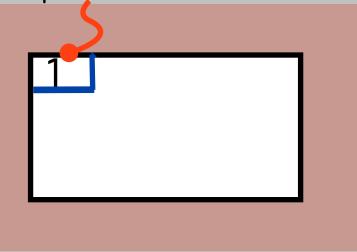
Constant T and μ



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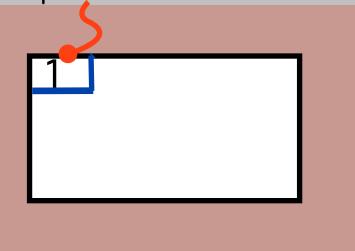
Constant T and μ

<u>Total system</u> is isolated and the volume is constant



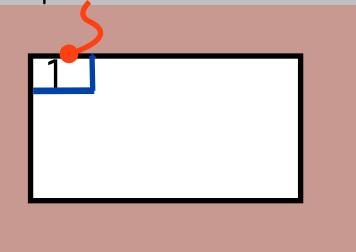
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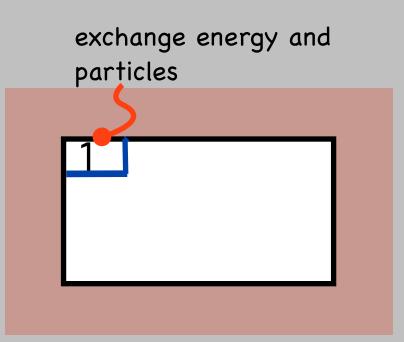
Constant T and μ

Total system is isolated and the volume is constant First law $dU = TdS - pdV + \mu dN = 0$ Second law



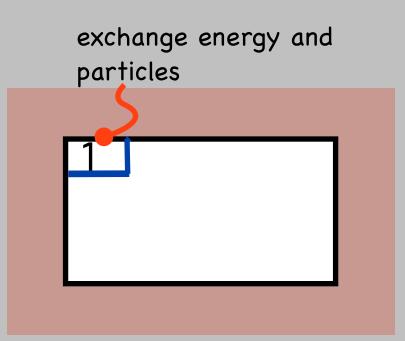
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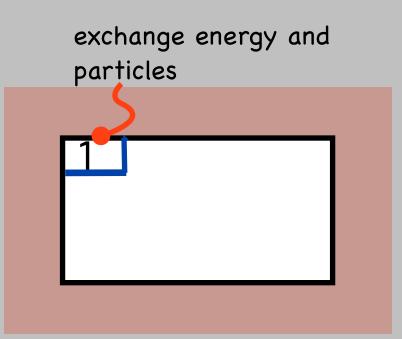
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Box 1: constant chemical potential and temperature

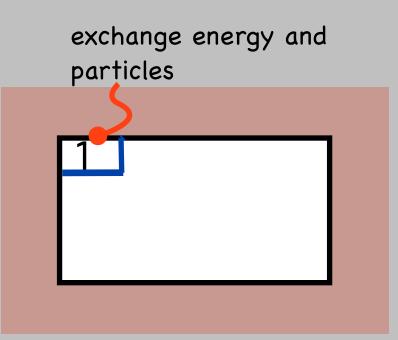


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<u>Box 1</u>: constant chemical potential and temperature 1st law:

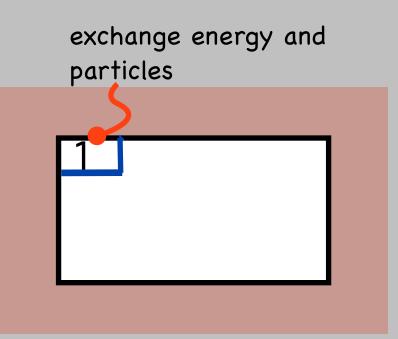


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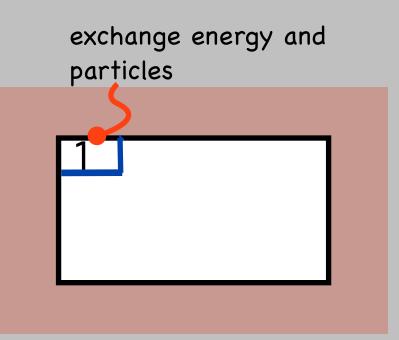
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Box 1: constant chemical potential and temperature1st law: $dU_1 + dU_b = 0$ $dV_1 + dV_b = 0$ $dN_1 + dN_b = 0$ or $dN_b = -dN_1$



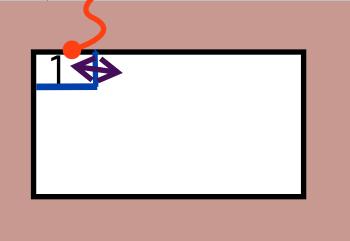
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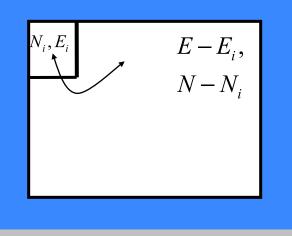
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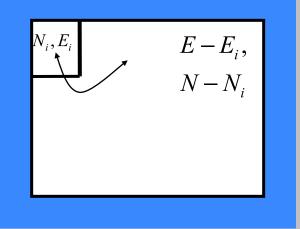
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Hence, for a system at constant temperature and chemical potential pV increases and takes its maximum value at equilibrium

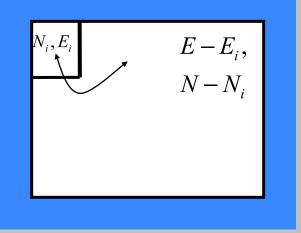


Consider a small system that can exchange particles and energy with a big reservoir



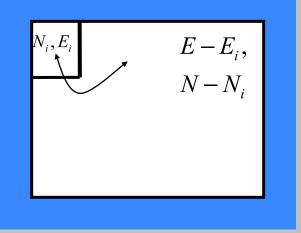
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$$\ln \Omega \Big(E - E_i, N - N_j, \Big) = \ln \Omega \Big(E, N \Big) - \left(\frac{\partial \ln \Omega}{\partial E} \right)_{V,N} E_i - \left(\frac{\partial \ln \Omega}{\partial N} \right)_{E,V} N_j + \cdots$$



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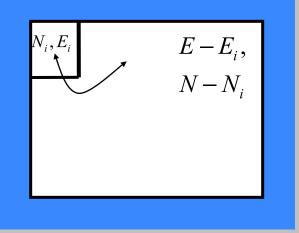
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The terms in the expansion follow from the connection with Thermodynamics: $S = k_B \ln \Omega$



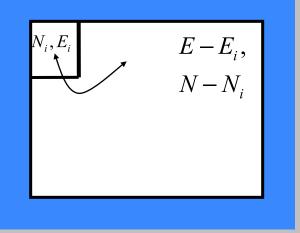
μ , V, T ensemble

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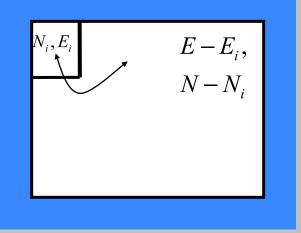


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$$\Omega \left(E - E_i, N - N_j \right) = E_i - \mu$$

$$\ln \frac{(E,N)}{\Omega(E,N)} = -\frac{E_i}{k_B T} + \frac{\mu}{k_B T} N$$

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Hence, the probability to find E_i, N_j :

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Hence, the probability to find E_i, N_j :

$$P(E_i, N_j) = \frac{\Omega(E - E_i, N - N_j)}{\sum_{k,l} \Omega(E - E_k, N - N_l)} \propto \exp\left[-\frac{E_i}{k_B T} + \frac{\mu N_i}{k_B T}\right]$$

μ ,V,T ensemble (2)

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The probability to find a particular N, \mathbf{r}^N configuration:

$$P(N,\mathbf{r}^N) \propto \exp\left[\beta\mu N - \beta U(r^N)\right]$$