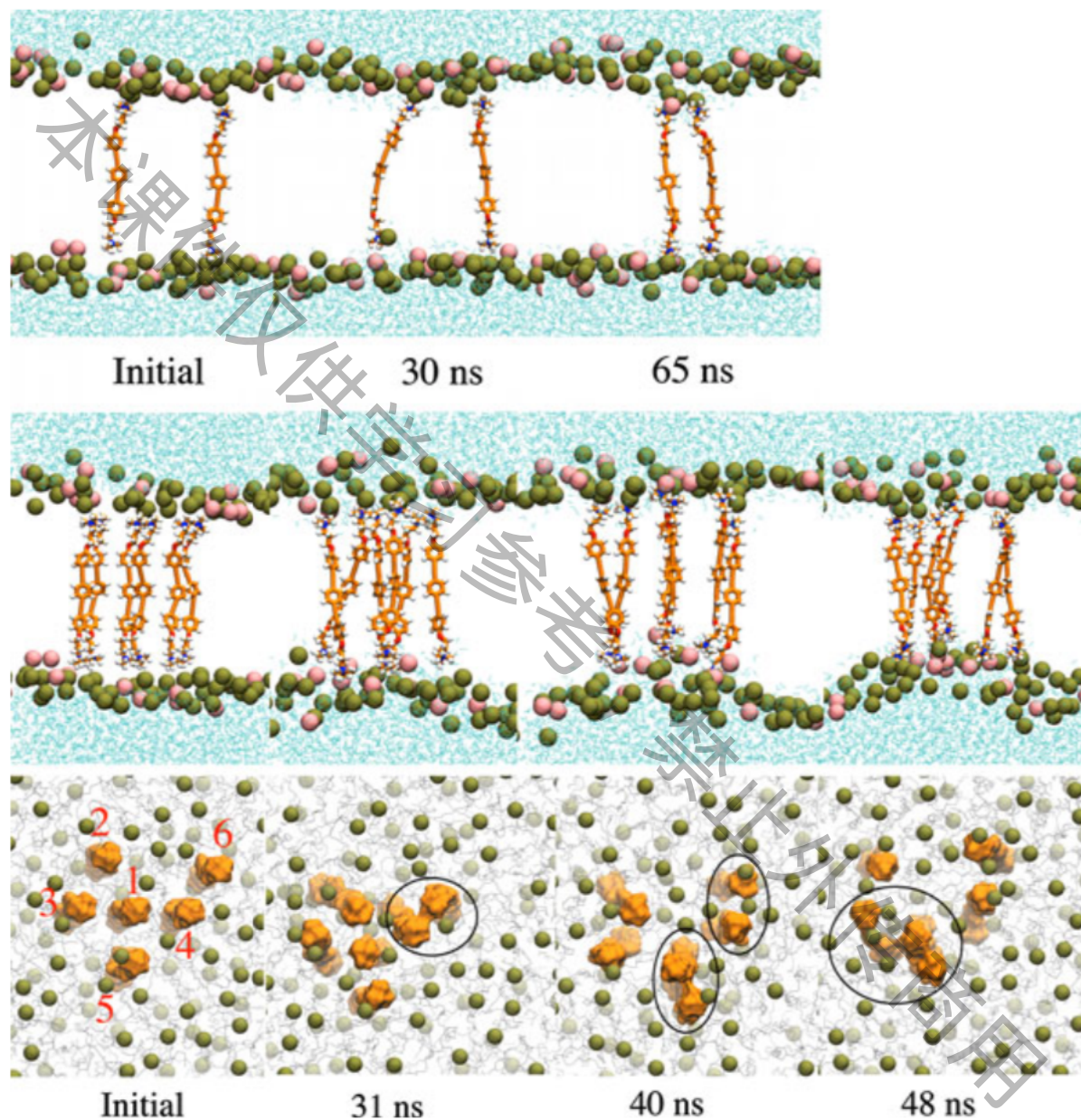




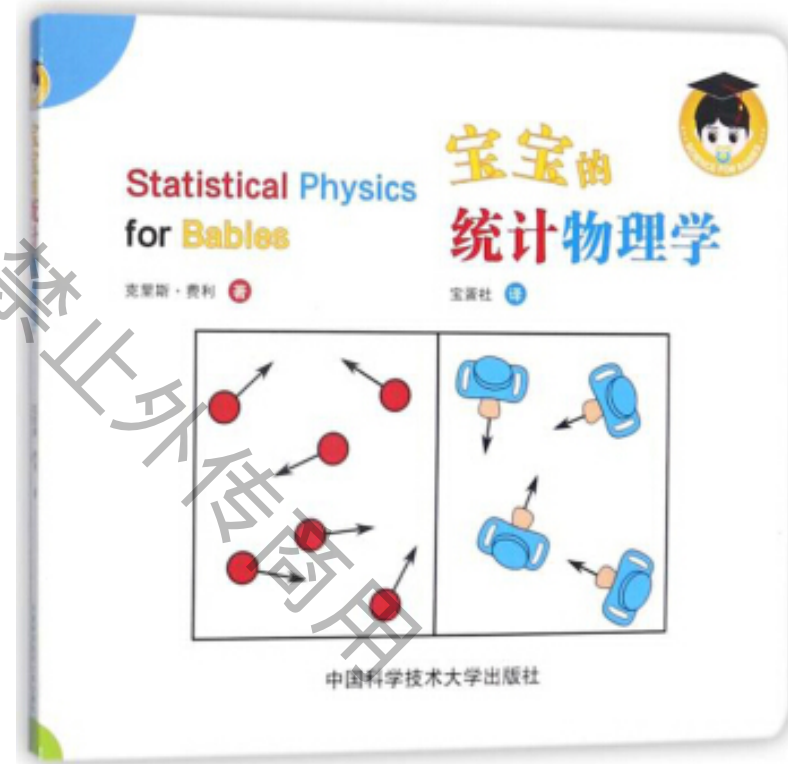
1. Li, Y.; Guo, H. Atomistic simulations of an antimicrobial molecule interacting with a model bacterial membrane. *Theor Chem Acc* **2012**, 132 (1), 1-8.

Distraction: Ergodic hypothesis

$$\langle A \rangle = \int A \exp(-\beta E) d\Gamma = \frac{1}{T} \int_0^\infty A(t) dt$$

$$= \lim_{N_{\text{step}} \rightarrow \infty} \frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{step}}} A(i\Delta t),$$

Ensemble average =
Time average



Ergodic hypothesis

$$\begin{aligned}\langle A \rangle &= \int A \exp(-\beta E) d\Gamma \\ &= \int d\mathbf{p}_1 \int d\mathbf{p}_2 \cdots \int d\mathbf{p}_N \int d\mathbf{q}_1 \int d\mathbf{q}_2 \cdots \int d\mathbf{q}_N A(\mathbf{p}, \mathbf{q}) \exp(-\beta E(\mathbf{p}, \mathbf{q}))\end{aligned}$$

$$\mathbf{p} = (\mathbf{p}_1, \mathbf{p}_2, \cdots, \mathbf{p}_N), \quad \mathbf{q} = (\mathbf{q}_1, \mathbf{q}_2, \cdots, \mathbf{q}_N)$$

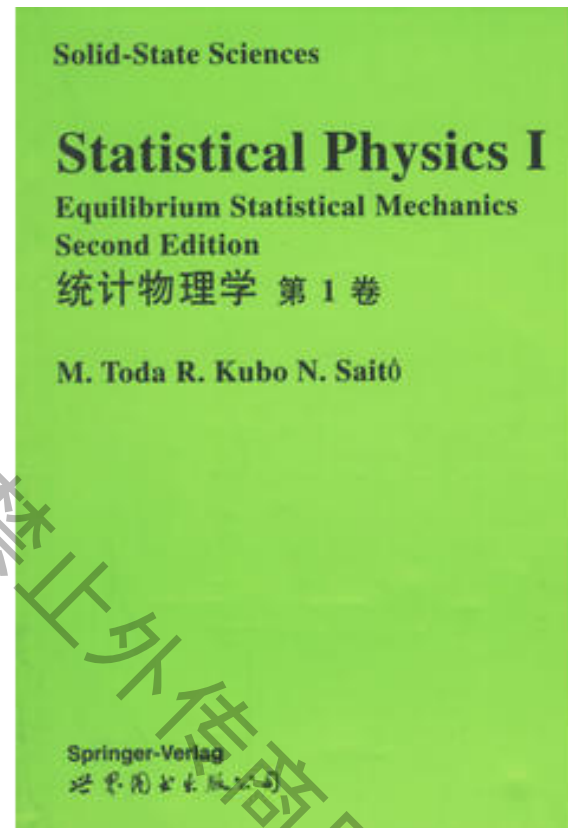
$$= \frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{step}}} A(i\Delta t),$$

Ergodic hypothesis

对于一般的某一力学体系（动力系统），常常不满足；
但是对于很多力学体系组成的系综，至今应用此假设得到的结论正确！原因：系综中的体系不会完全无相互作用！

Ensemble average equal to
time average

Toda, Kubo, Saito, *Statistical Physics I*, Springer-Verlag, 1983

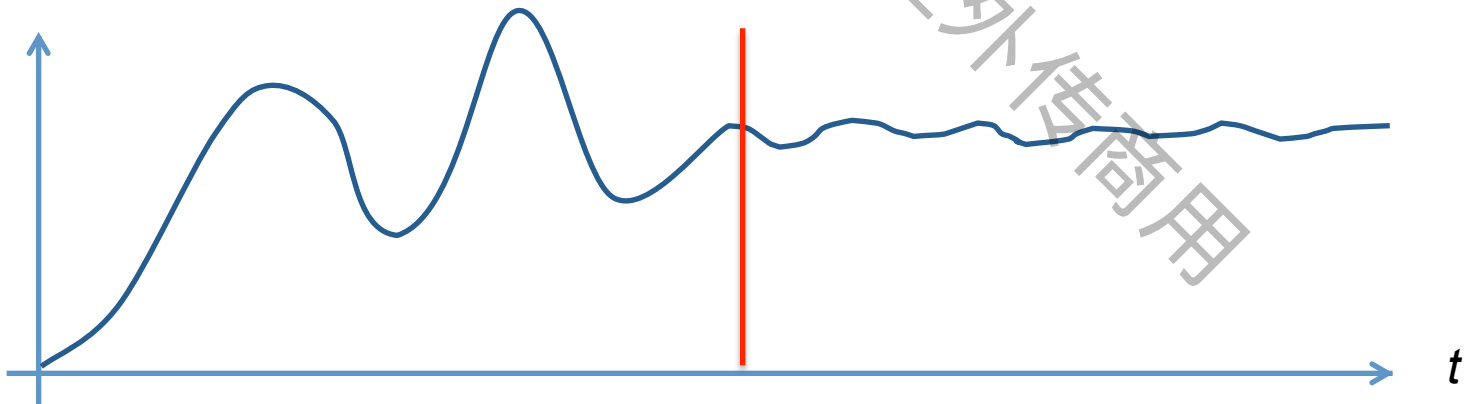


Time average of physical variables

$$\langle E \rangle = \frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{step}}} E_i$$

$$\langle T \rangle = \frac{m \langle v^2 \rangle}{3k_B} = \frac{1}{N_{\text{step}}} \frac{m}{3k_B} \sum_{i=1}^{N_{\text{step}}} \frac{1}{N_{\text{particle}}} \sum_{j=1}^{N_{\text{particle}}} v_j^2$$

In general, $i=1$ is not the *initial* time!
Must discard all non-equilibrium trajectories



Mean value and fluctuation

$$\text{STD}(E) = \sqrt{\frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{step}}} (E_i - \langle E \rangle)^2} \quad \text{标量!}$$

$$= \sqrt{\frac{1}{N_{\text{step}}} \left(\langle E^2 \rangle - \langle E \rangle^2 \right)}$$



Mean value and fluctuation

$$\frac{\langle (\Delta K)^2 \rangle}{\langle K \rangle^2} = \frac{2}{3N} \left(1 - \frac{3N}{2C_V} \right)$$

Phys. Rev. 153: 250 (1967)

$$P_{\text{int}} = Nk_B T - \frac{1}{3} \left\langle \sum_{i < j} r_{ij} \frac{\partial U(R)}{\partial r_{ij}} \right\rangle$$

J. P. Hansen, I. R. McDonald, *Theories of simple liquid*,
3rd ed. 2.2.9

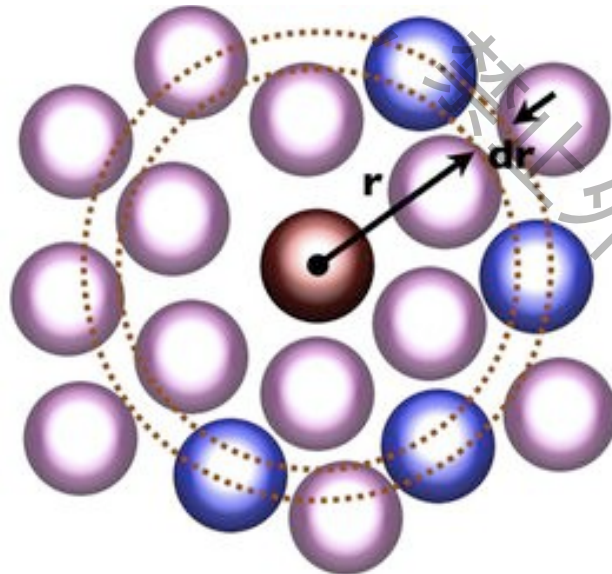
Radial distribution: $g(r)$

1. histogram

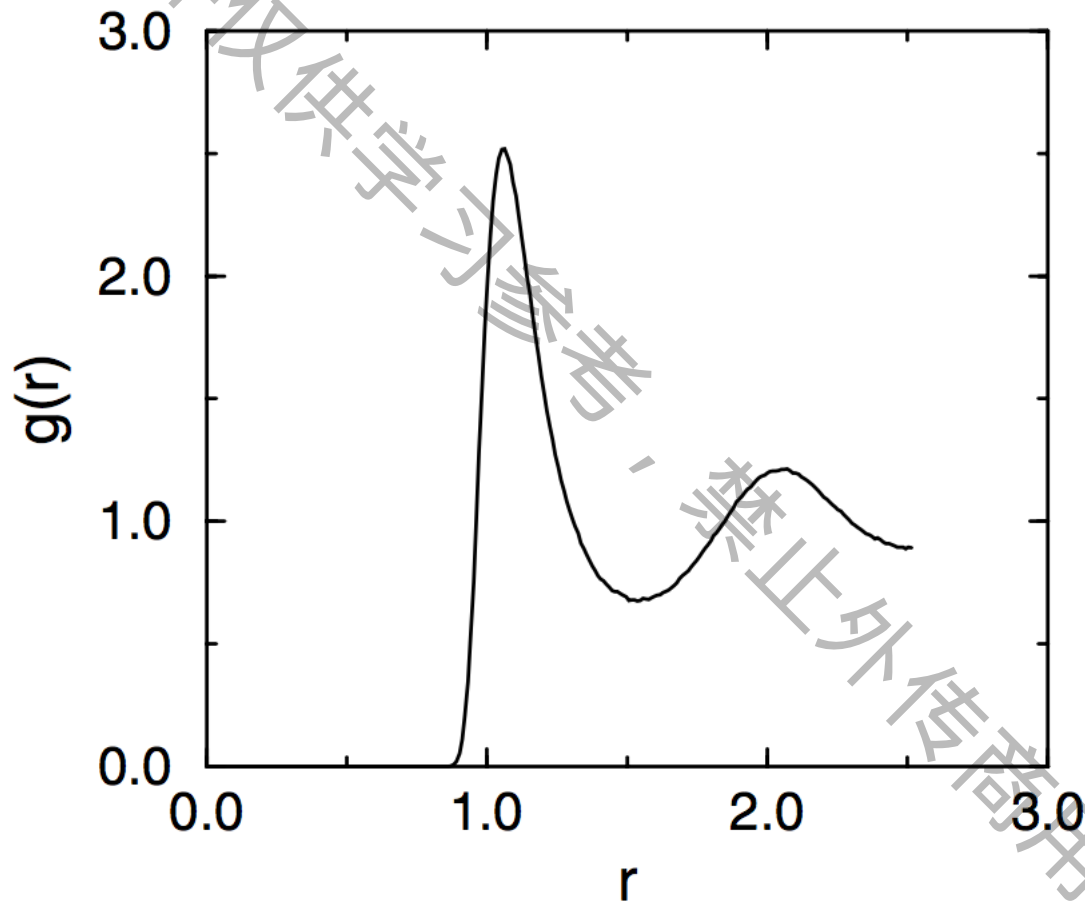
$$n(r) = \text{hist}(XX)$$

2. $g(r)$

$$g(r) = \frac{2V}{N(N-1)} \left[\frac{\langle n(r) \rangle}{4\pi r^2 (\Delta r)} \right]$$



Radial distribution: $g(r)$



$T=1.5043$; $\rho=0.8442$

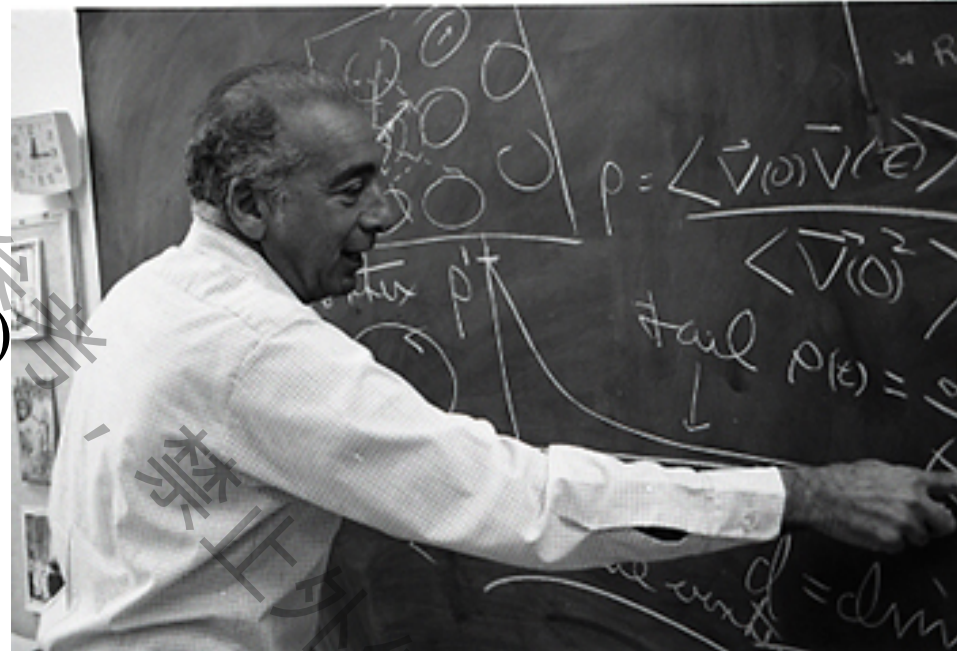
Dynamic information: correlation function

$$\begin{aligned}
 C_{AA}(t) &= \langle A(t)A(0) \rangle \\
 &= \frac{1}{T} \int A(\tau)A(t-\tau) d\tau \\
 &= \frac{1}{N-m} \sum_{i=1}^{N-m-1} A(i)A(i+t/\Delta t)
 \end{aligned}$$

$$t = m \cdot \Delta t$$

e. g.

$$\langle C_{\mu\mu}(t) \rangle = \frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{needed}}} \mu(i) \cdot \mu(i+t/\Delta t), \quad \mu = \sum_{j=1}^{N_{\text{particle}}} e_j r_j$$



Correlation function

$$C_{XY}(t) = \langle \delta X(t) \cdot \delta Y(0) \rangle$$



$$= \frac{1}{T} \int (X(\tau) - \langle X \rangle) \cdot (Y(t - \tau) - \langle Y \rangle) dt$$

$$= \frac{1}{N - m} \sum_{i=1}^{N-m-1} (X(m+i) - \langle X \rangle) \cdot (Y(i) - \langle Y \rangle),$$

$$t = m \cdot \Delta t$$

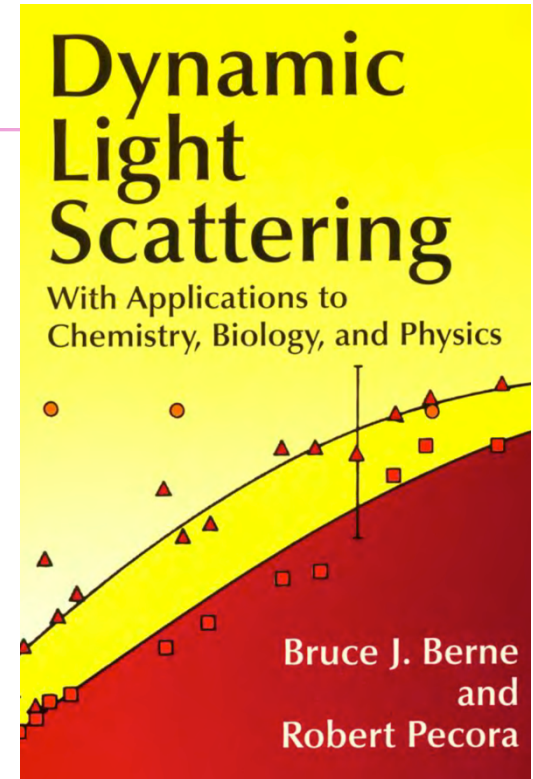
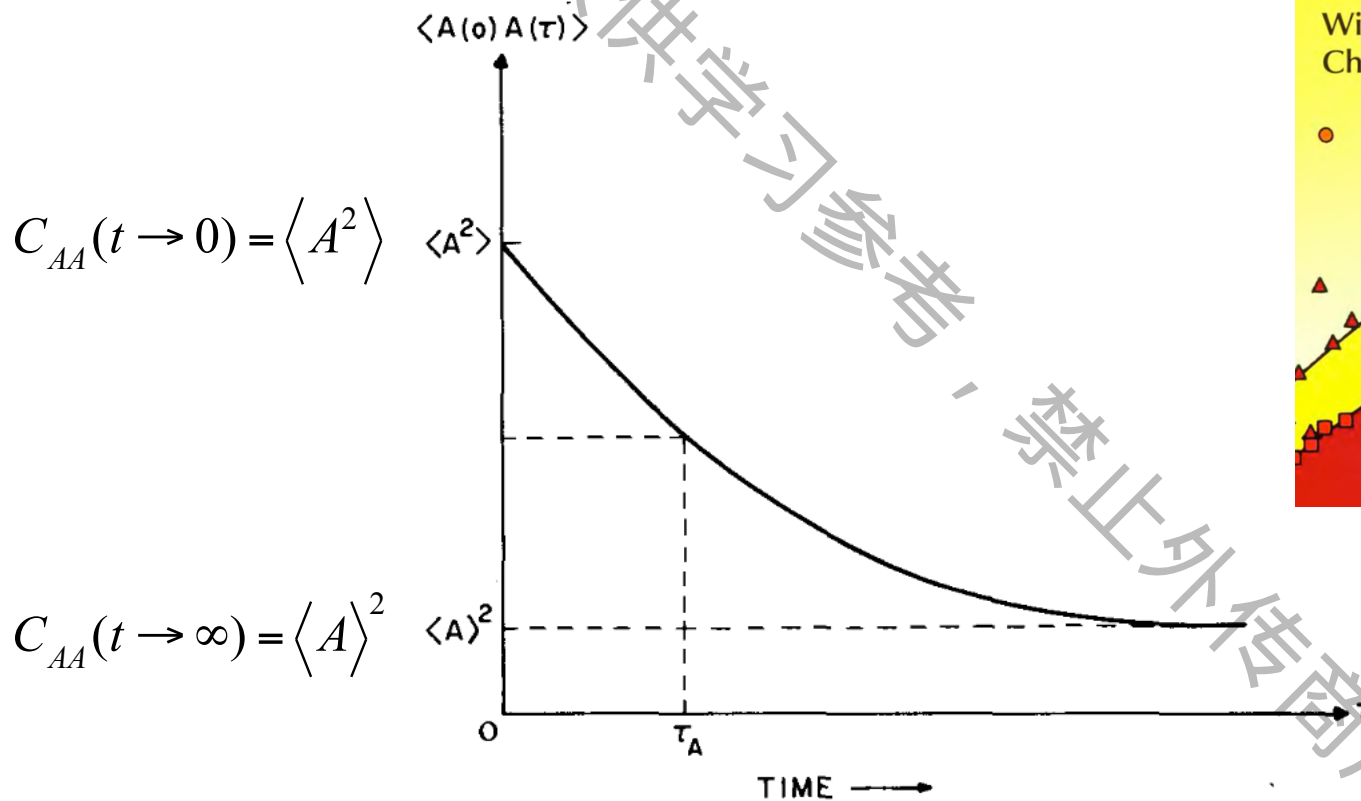
Usage:

(1) Exploration of correlated variables

(2) Validation of the system having reached equilibrium.

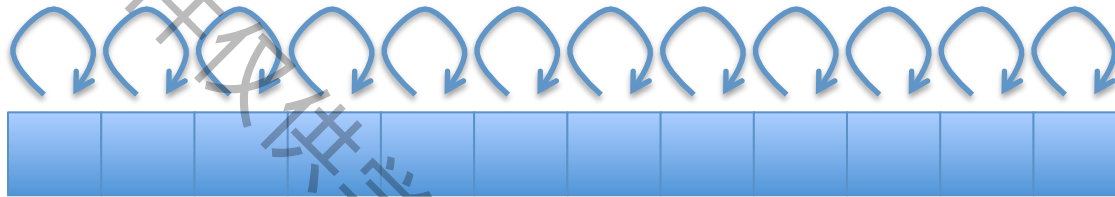
$$c_{XY}(t) = \frac{C_{XY}(t) - \langle X \rangle \cdot \langle Y \rangle}{\text{STD}(X) \cdot \text{STD}(Y)}$$

Onsager's *regression of spontaneous fluctuations*:
A consequence of Fluctuation-Dissipation Theorem.

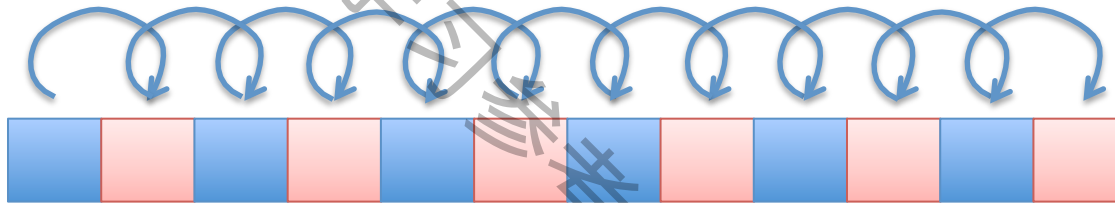


Calculation of auto-correlation

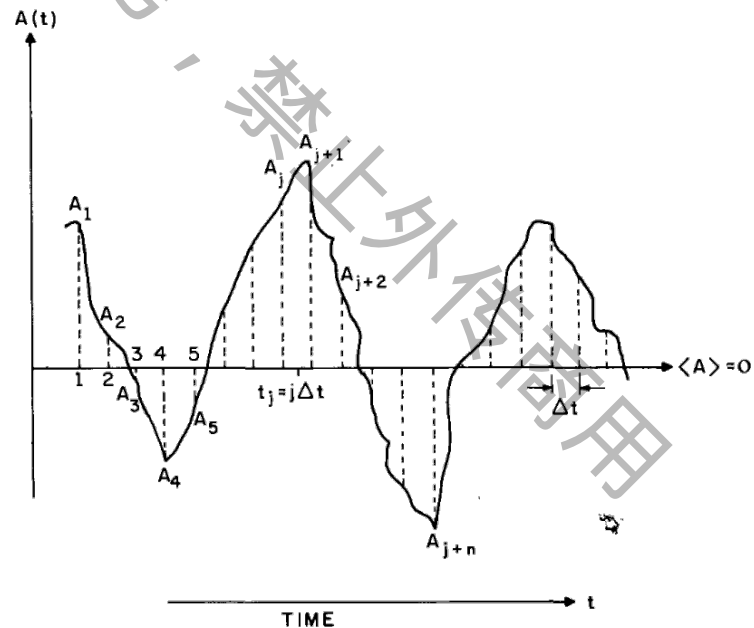
$C_{AA}(1)$



$C_{AA}(2)$

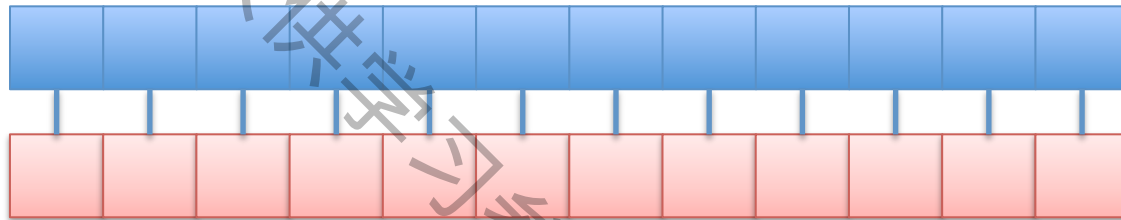


.....

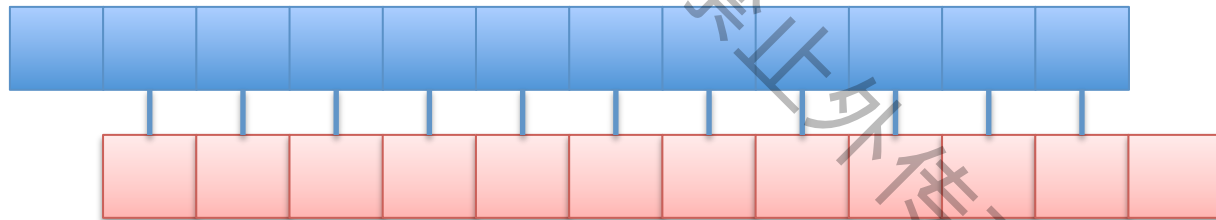


Calculation of cross-correlation

$C_{AB}(1)$



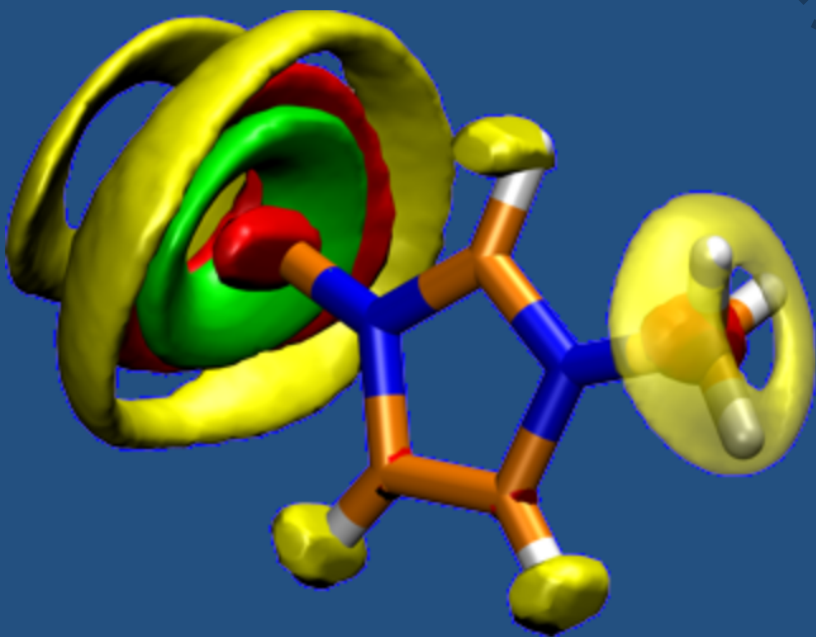
$C_{AB}(2)$



.....

Software of obtaining $C(t)$: Travis

TRAVIS - Trajectory Analyzer and Visualizer



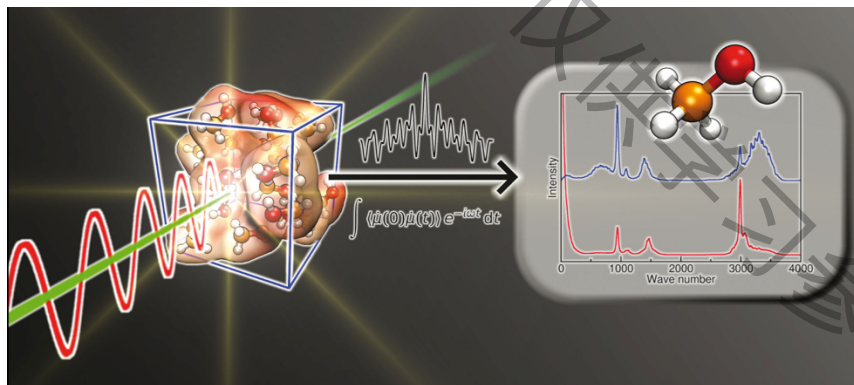
The homepage has moved:
<http://www.travis-analyzer.de>

Last page update: Oct 13 2016
Last program update: Oct 13 2016
(current version: 1.14.0)

>> Critical bug fix <<

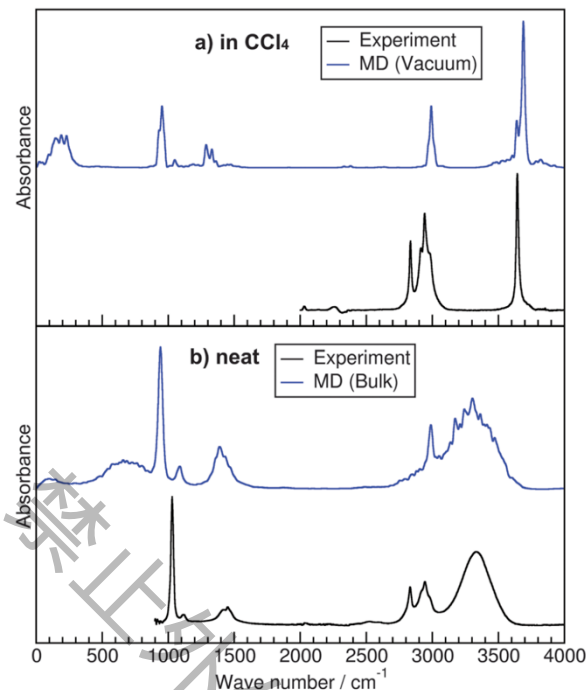
What is TRAVIS?

Application of $C(t)$: spectra



$$\langle C_{\dot{x}\dot{x}}(t) \rangle = \frac{1}{N_{\text{step}}} \sum_{i=1}^{N_{\text{needed}}} \dot{\mu}(i) \cdot \dot{\mu}(i + t / \Delta t)$$

$$A(\omega) \propto \int \langle C_{\dot{x}\dot{x}}(t) \rangle e^{-i\omega t} dt$$



Computing **vibrational spectra** from *ab initio* molecular dynamics
Phys. Chem. Chem. Phys., 2013, 15, 6608--6622

Dynamic information: MI

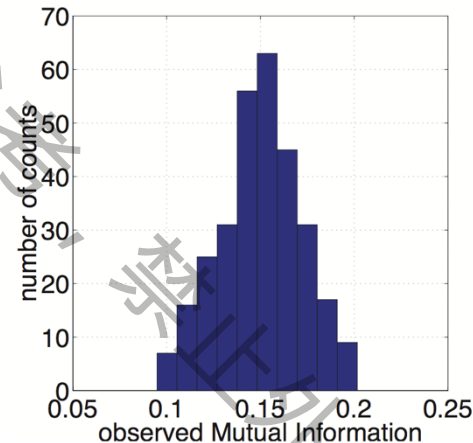
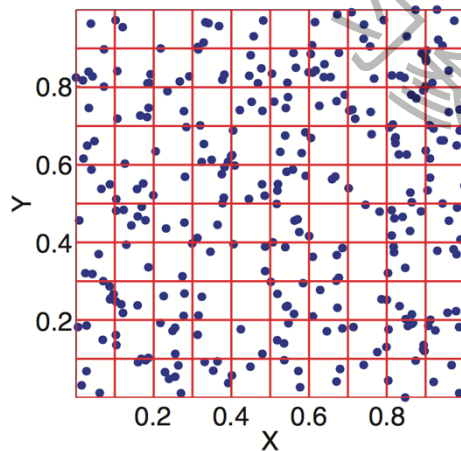
Mutual Information

$$MI = \sum_{ij} p(a_i, b_j) \log \frac{p(a_i, b_j)}{p(a_i)p(b_j)}$$



Pro: Can show the correlations between orthogonal variables, and non-linear correlations.

Con: Can show correlation only, but not causality. (One can use **Transfer Entropy** to explore causality)



$$p(a_i) = n(a_i) / N$$

$$p(b_j) = n(b_j) / N$$

$$p(a_i, b_j) = n(a_i, b_j) / N$$

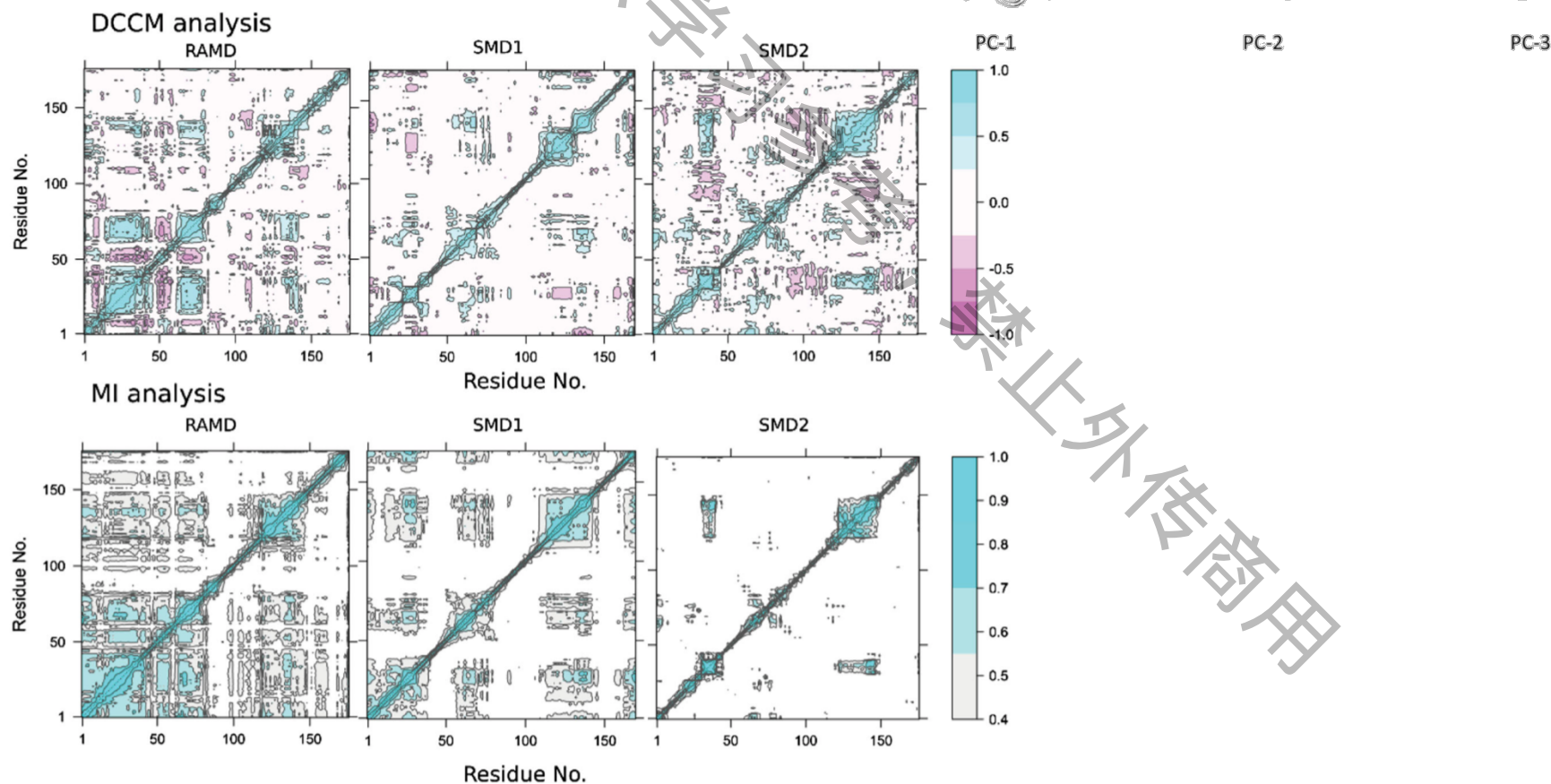
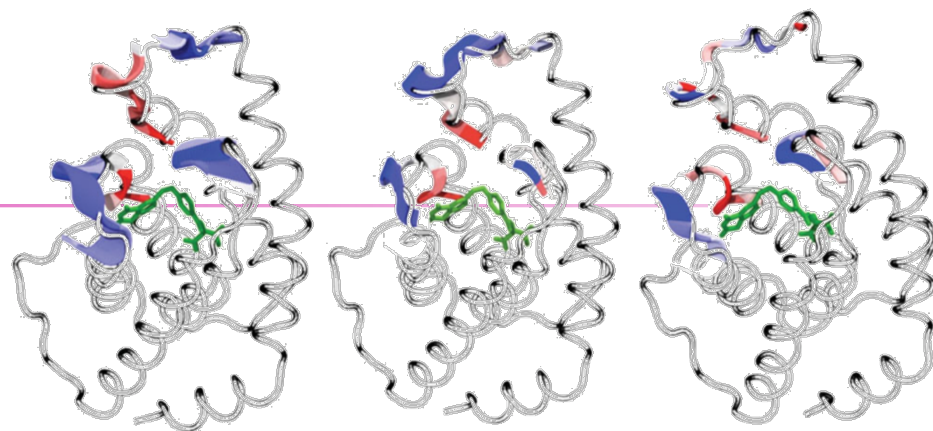
$$MI^{\text{observed}} \approx MI + \text{error}$$

$$\text{error} = \frac{M_{ab} - M_a - M_b + 1}{2N}$$

Exploring the correlation among different parts in MD

Application of MI:

L. Q. Qiu, C. Shen, J. N. Song, Y. K. Zhang and J. Z. H. Zhang, *Molecular Physics* **116** (19-20), 2613-2621 (2018).



Challenges of MD

$$\langle F \rangle = -k_B T \ln Q$$

$$\Delta \langle F \rangle = -k_B T \ln \frac{Q_{\text{final}}}{Q_{\text{start}}}$$

$$Q = ???$$

$$F = ???$$

$$S = ???$$



Brief summary

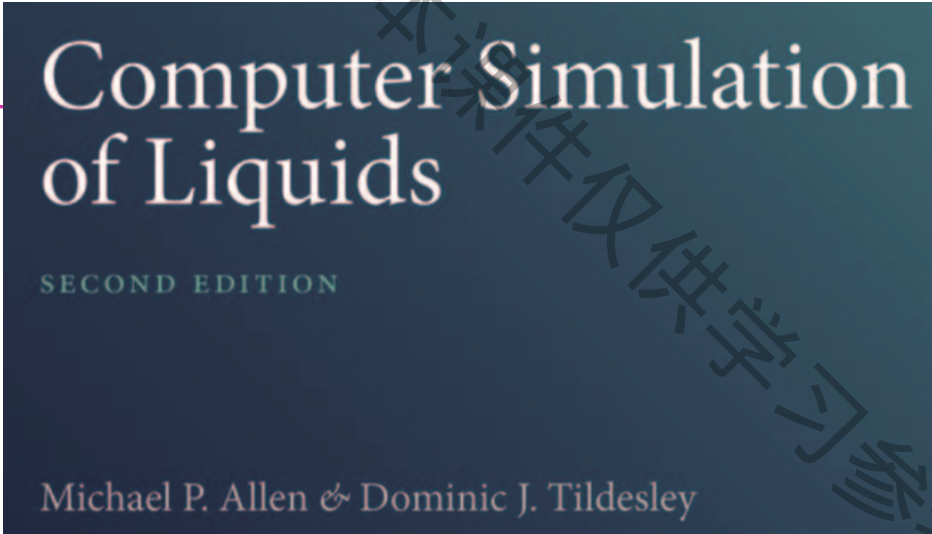
牛顿力学／量子力学的**轨迹**

轨迹的**时间平均**获得物理量

可获得体系的**动态**信息

挑战依然存在

Classics

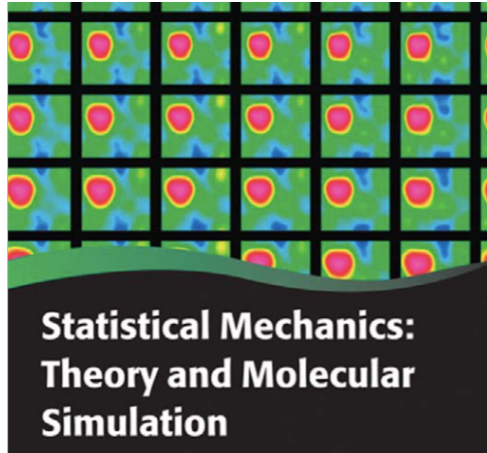
The image shows the front cover of the book 'Computer Simulation of Liquids'. The title is in a large, white, serif font against a dark blue background. Below the title, 'SECOND EDITION' is written in a smaller, green, sans-serif font. At the bottom, the authors' names 'Michael P. Allen & Dominic J. Tildesley' are listed in a white, sans-serif font.

Computer Simulation of Liquids

SECOND EDITION

Michael P. Allen & Dominic J. Tildesley

Oxford University Press, 2017, 30年后第二版!



Mark E. Tuckerman
Oxford University Press, 2010

Understanding Molecular Simulation

From Algorithms to Applications

D. Frenkel and B. Smit,
Academic Press, 2002

Elements of Molecular Dynamics

W. Smith

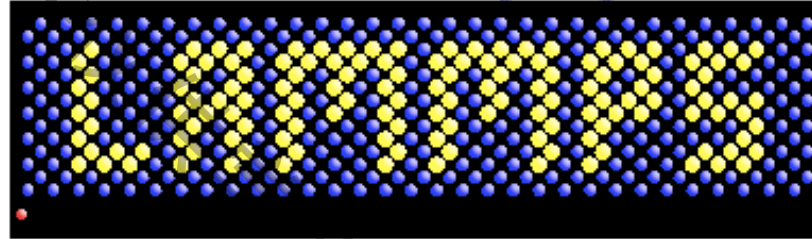
<https://epubs.stfc.ac.uk/work/20477621>

2014年最新版! 免费!

Softwares

D E Shaw Research

hover to animate -- [input script](#)



[physical analog \(start at 3:25\)](#) & [explanation](#)

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"insert clever motto here"
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Softwares



GROMACS FAST.
FLEXIBLE.
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NAMD
Scalable Molecular Dynamics



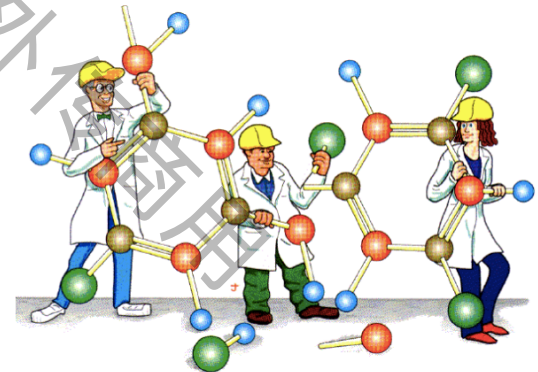
CHARMM

Chemistry at HARvard Macromolecular Mechanics

TINKER Molecular Modeling

 **STFC** **DL_POLY**
Scientific Computing Department

[STFC Home](#) > [SCD Home](#) > [Research and Development](#) > [Applications Division](#) > [Computational Chemistry](#)
The DL_POLY Molecular Simulation Package



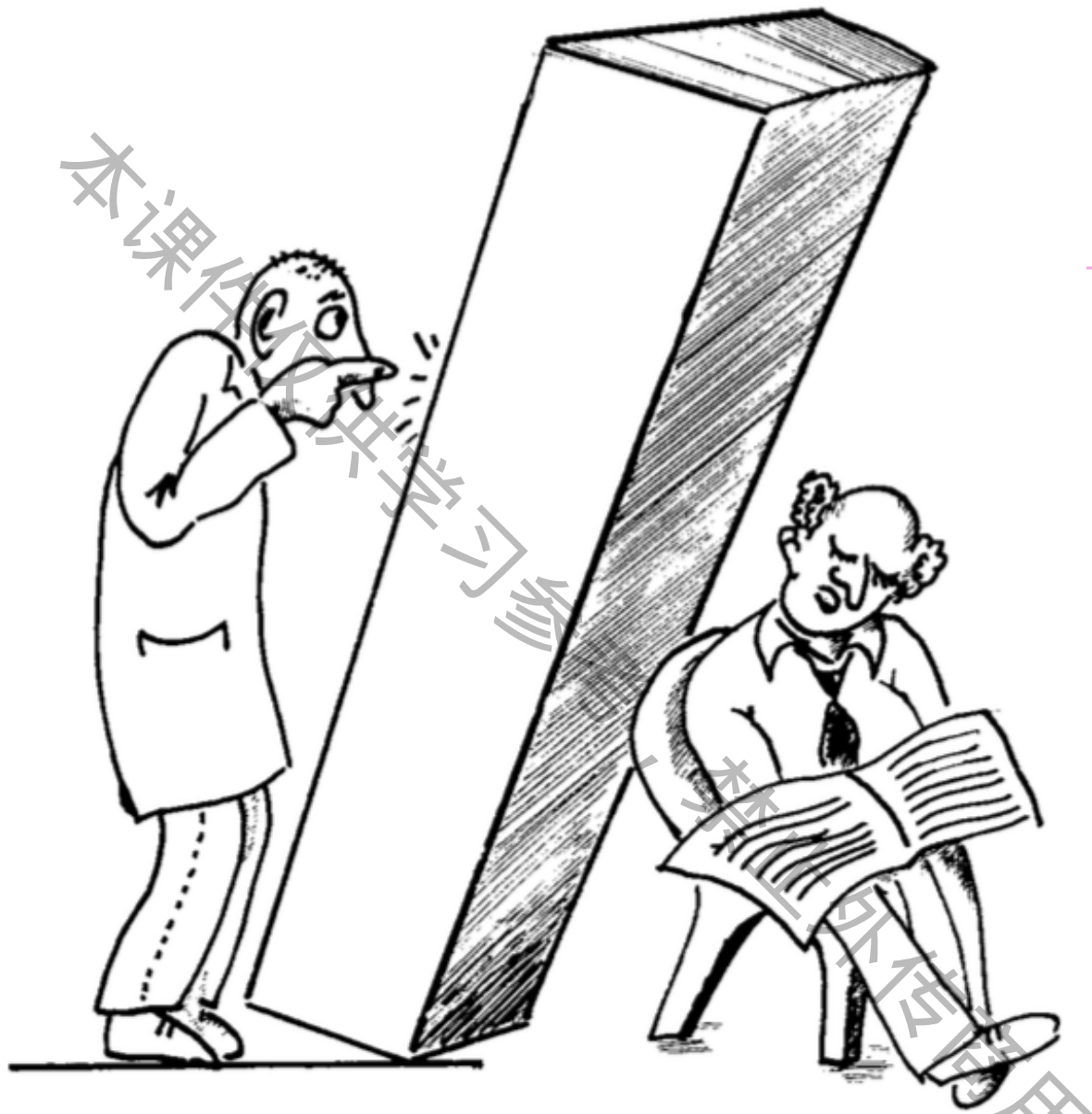
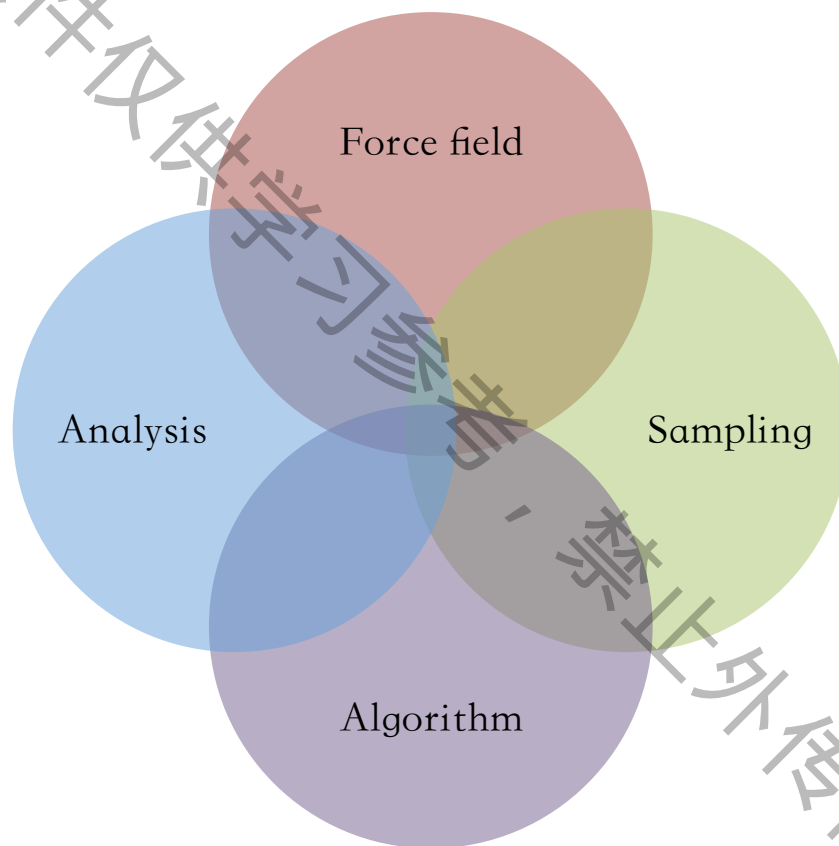


Figure 1.2. Studying responses of a 'black box'.

Frontiers of MD

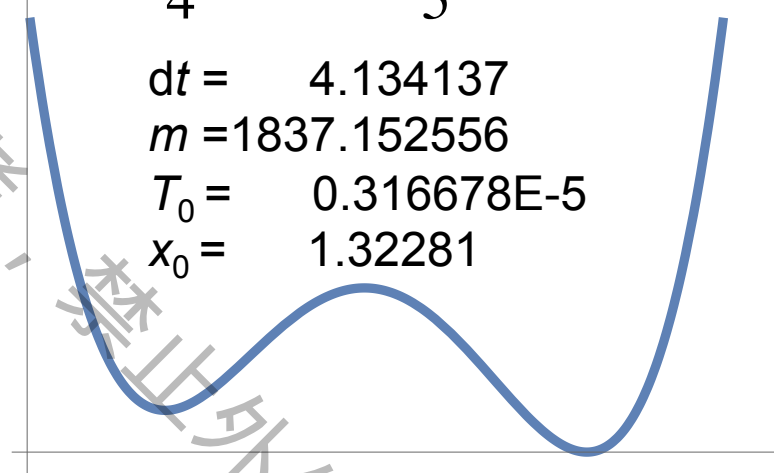


作业

1. 一维双势阱问题：

$$V(x) = c_1 + c_2 x + c_3 x^2 + c_4 x^3 + c_5 x^4$$

c_1	9.134
c_2	-10.201
c_3	4.542
c_4	-0.744
c_5	0.04



请编写程序，运行，并修改以模拟自己感兴趣的问题

作业

Ar流体

$$U(r) = 4\varepsilon \left[\left(\frac{\sigma}{r} \right)^{12} - \left(\frac{\sigma}{r} \right)^6 \right]$$

程序中使用约化单位，保证数值在0附近，不会过大 / 过小

$$U^*(r^*) = 4 \left[\left(\frac{1}{r^*} \right)^{12} - \left(\frac{1}{r^*} \right)^6 \right]$$

能量单位用 ε 、长度单位用 σ ，质量单位用1个原子的质量，这样时间单位、温度也都化为约化单位：

$$t^* = t / \left(\sigma \sqrt{\frac{m}{\varepsilon}} \right), \quad T^* = T / \left(\frac{\varepsilon}{k_B} \right)$$

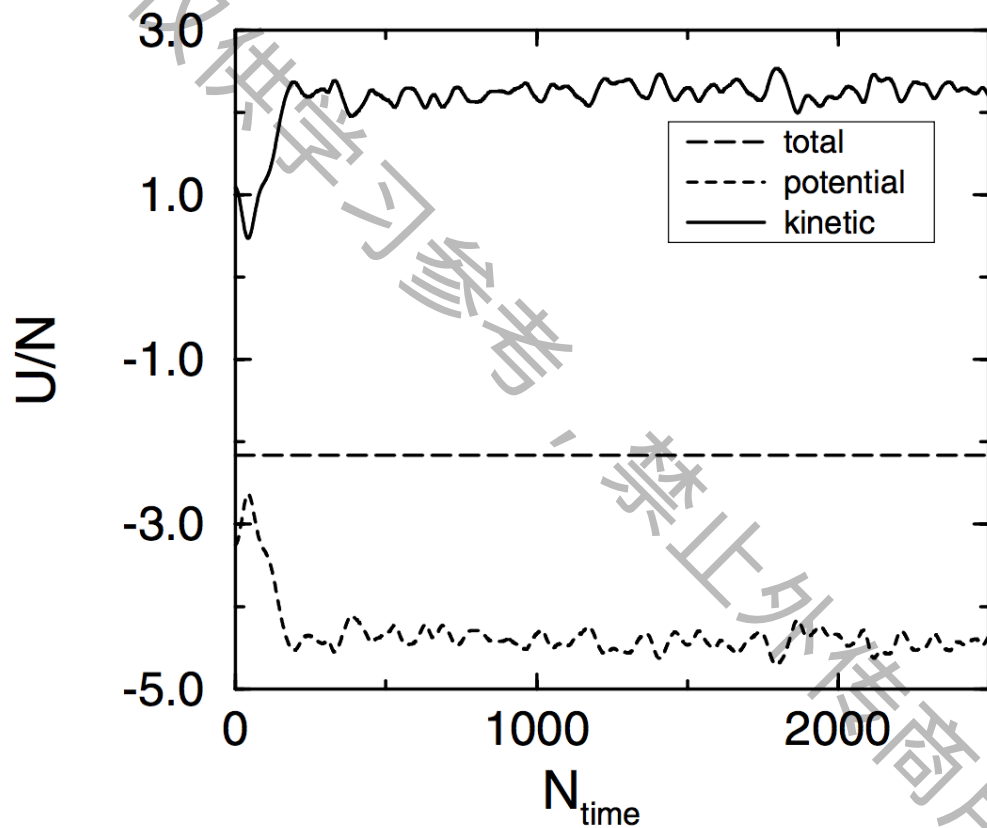
作业

Ar流体

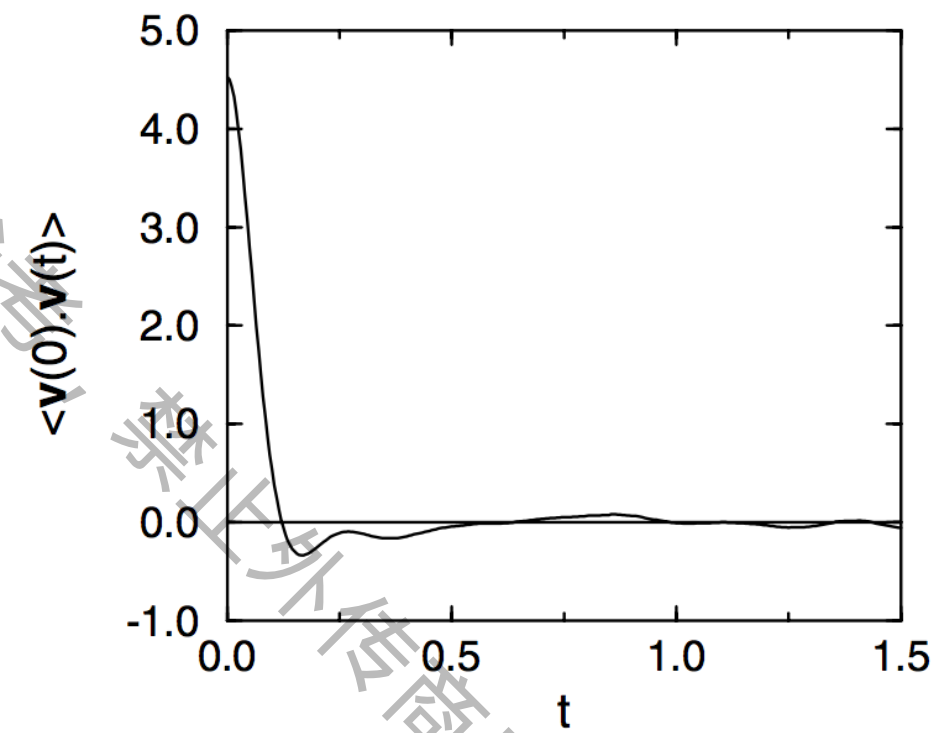
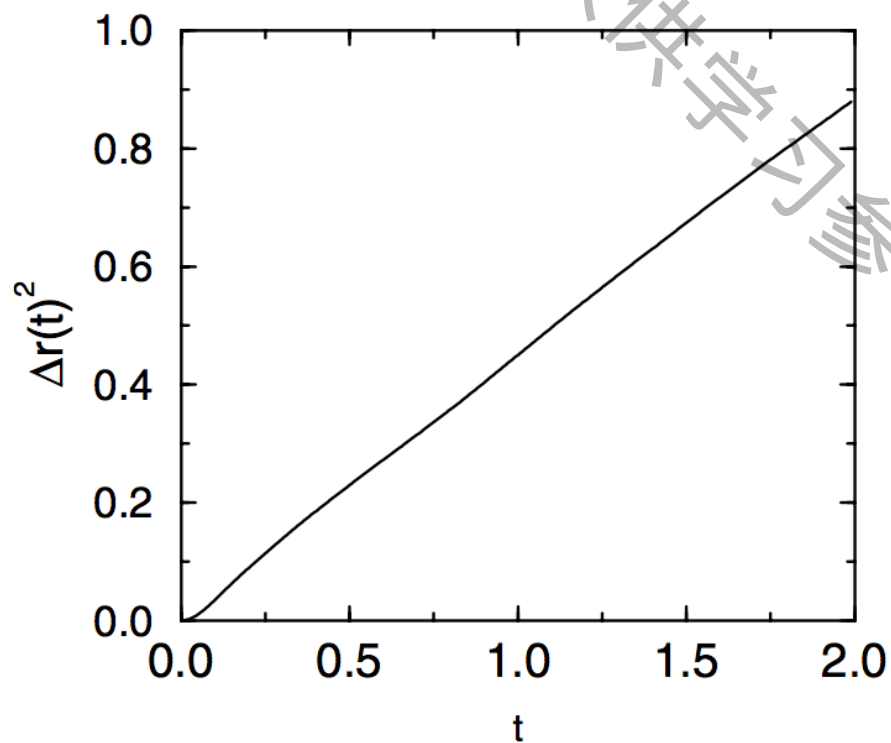
Quantity	Reduced units		Real units
temperature	$T^* = 1$	$\leftrightarrow$	$T = 119.8 \text{ K}$
density	$\rho^* = 1.0$	$\leftrightarrow$	$\rho = 1680 \text{ kg/m}^3$
time	$\Delta t^* = 0.005$	$\leftrightarrow$	$\Delta t = 1.09 \times 10^{-14} \text{ s}$
pressure	$P^* = 1$	$\leftrightarrow$	$P = 41.9 \text{ MPa}$

$\epsilon/k_B = 119.8 \text{ K}$ 、长度单位用 $\sigma = 3.405 \text{ \AA}$ ，质量 0.03994 kg/mol ，864个原子。

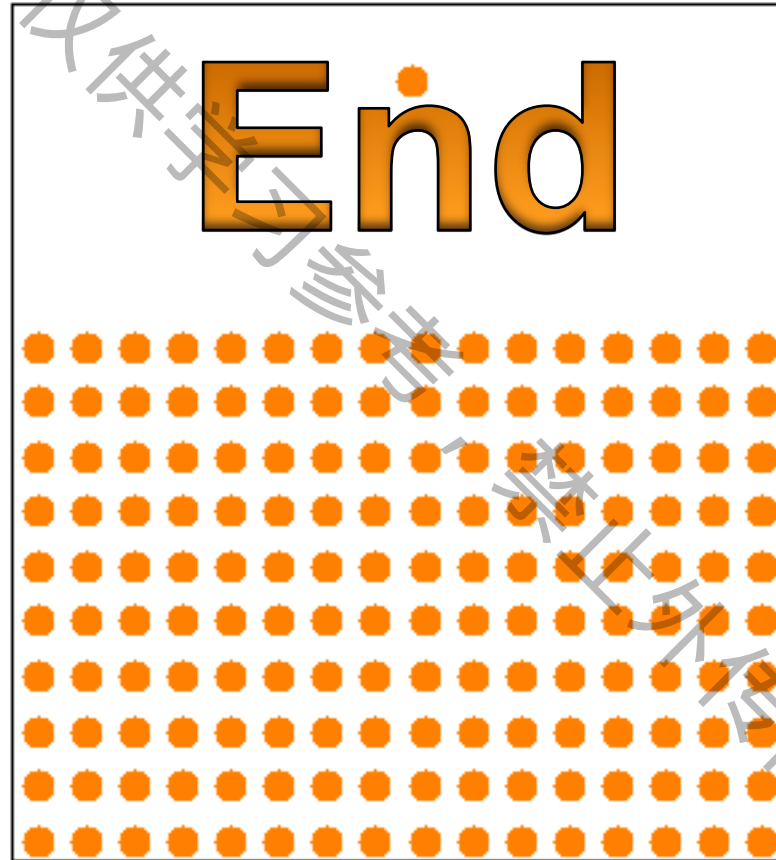
作业：Ar体系能量随时间变化



作业：Ar体系的均方位移与速度 关联函数



time 0.0041 ps



办公室：E楼121，电话：021-66136131；邮箱：yongleli@shu.edu.cn