

METROPOLIS SIMULATIONS IN THE CANONICAL ENSEMBLE<sup>①</sup>  
FOR A FLUID

For a canonical ensemble

$$\pi(\bar{r}_1, \dots, \bar{r}_N) = \frac{1}{Z} e^{-\beta U(\bar{r}_1, \dots, \bar{r}_N)}$$

We wish to define a proposal

The system is in a configuration  $x = \{r_1, \dots, r_N\}$

We must define (choose) a new configuration  $y$

We proceed as follows:

i) we choose one particle among the  $N$  particles

$$i = 1 + \text{integer part of } (N * \text{RAN}( ))$$

[we choose a random number  $i$  UNIFORMLY  
among 1, 2, ...,  $N$ ]

ii) we set  $r'_i = (x'_i, y'_i, z'_i)$

$$x'_i = r_{ix} + \Delta (\text{RAN}( ) - 0.5)$$

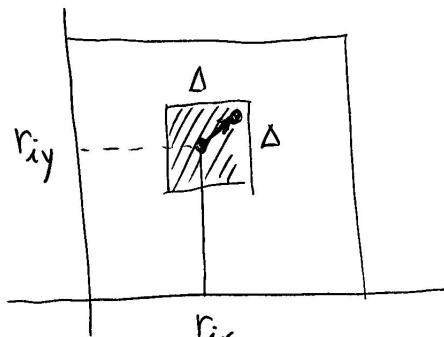
$$y'_i = r_{iy} + \Delta (\text{RAN}( ) - 0.5)$$

$$z'_i = r_{iz} + \Delta (\text{RAN}( ) - 0.5)$$

$\Delta$  is a parameter  
TO BE FIXED

The new conf is

$$y = (r_1, \dots, r_{i-1}, r'_i, r_{i+1}, \dots, r_N)$$



IN PRACTICE:

We "move" the particle  
inside a cube of size  $\Delta$   
centered around the old  
position

[IGNORE THE BOUNDARIES, FOR  
NOW]

The probability density of this move is

$$\frac{1}{N} \times \frac{1}{\Delta^3}$$

↑                   ↑  
we choose       we choose a point  
i among       in a cube of size  $\Delta^3$   
 $N$  numbers

The probability density is independent of  $x$

The probability of going from  $x \rightarrow y$  =  
probability of going from  $y \rightarrow x$

THE PROPOSAL MATRIX IS SYMMETRIC

Acceptance:  $A_{xy} = \min\left(1, \frac{\pi_y}{\pi_x}\right) = \min\left(1, e^{-\beta U(y) + \beta U(x)}\right)$

Assume  $U(r_1, \dots, r_N) = \sum_{i < j} V(|r_i - r_j|)$  [two-body interactions]

We need to compute  $U(y) - U(x) = \Delta U$ .

In the differences all terms that do not include  $i$  cancel

$$U(y) - U(x) = \sum_{j \neq i} V(|\bar{r}'_i - \bar{r}_j|) - \sum_{j \neq i} V(|\bar{r}_i - \bar{r}_j|)$$

↑  
we fix  $i$  and sum over all  $j \neq i$   
(all particles that interact with  $i$ )

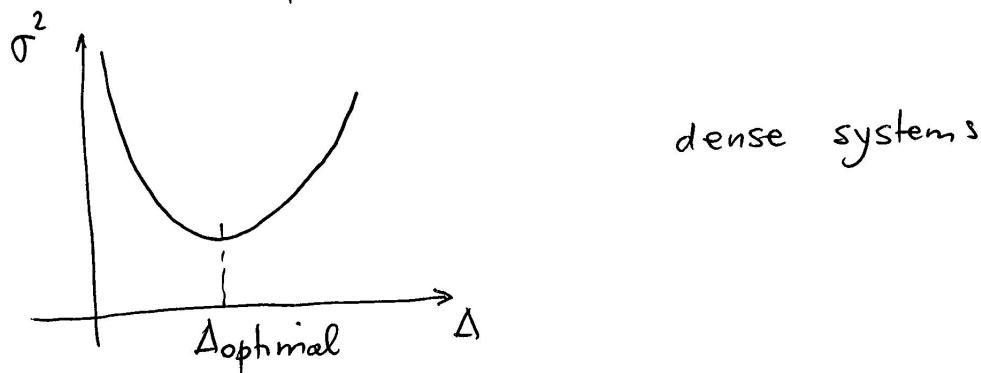
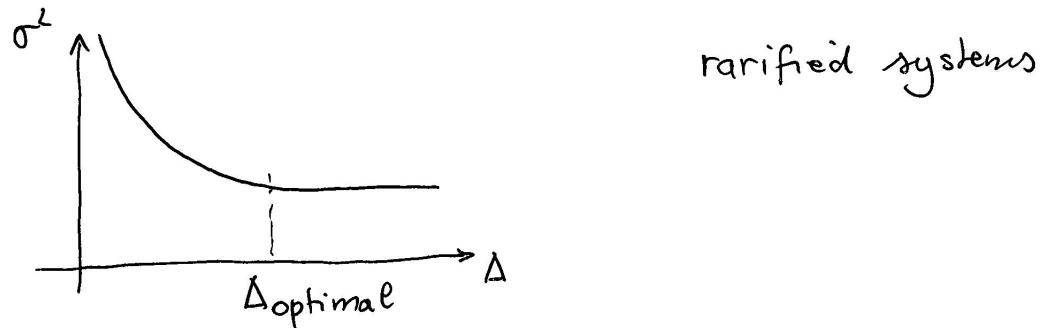
## THE PRACTICAL PROBLEM:

The algorithm depends on  $\Delta$ .

This is a crucial parameter for the efficiency.

AIM: Choose  $\Delta$  so as to obtain the smallest error for a given number  $N$  of iterations.

TYPICAL  $\Delta$  dependence



THE RULE OF THUMB:

Compute acceptance  $f = \frac{\text{number of accepted moves}}{\text{total number of attempted moves}}$

Choose  $\Delta$  so that  $30\% < f < 50\%$

The Metropolis update we have discussed work as follows (RANDOM UPDATE)

- (a) choose a particle  $i$  (RANDOMLY)
- (b) propose a movement of the particle  $i$
- (c) accept/reject the move.

Often sequential updates are used

FOR  $i = 1, \dots, N$  ( $N =$  number of particles)

- (a) propose a movement of the particle  $i$
- (b) accept/reject the move.

END FOR

In this sequential update, we move particles sequentially first we update particle 1, then particle 2, then particle 3, ..., up to particle  $N$  and then we start again with particle 1.

BASIC RESULT (it is not completely obvious):

The sequential algorithm satisfies the stationarity condition if its random version satisfies detailed balance.

The sequential algorithm does NOT satisfies detailed balance

CAVEAT: Sequential algorithms may have problems with ergodicity for system with discrete degrees of freedom (spin systems)

To avoid the problem one can mix random and sequential updates

## EFFICIENCY OF THE UPDATES:

- ⑥ For systems in which the relative position of the particles changes in the simulation (a gas, a liquid for example) sequential and random updates are EQUIVALENT.

The sequential update is (slightly) faster as it does not require 1 random number (the one used to choose the particle)

- ⑦ For spin systems, the sequential update is often more efficient, smaller errors for a given number of updates, and faster, less RNumbers. But, in this case, beware of ergodicity!