

# Computational statistical physics: The example of hard spheres

Lectures at the 16th Chris Engelbrecht Summer School in  
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Third part: Modern Algorithms

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# Computational statistical physics: the example of hard spheres

OXFORD MASTER SERIES IN STATISTICAL,  
COMPUTATIONAL, AND THEORETICAL PHYSICS

## Statistical Mechanics: Algorithms and Computations

Werner Krauth



oxford  
master series in  
condensed matter physics

Werner Krauth

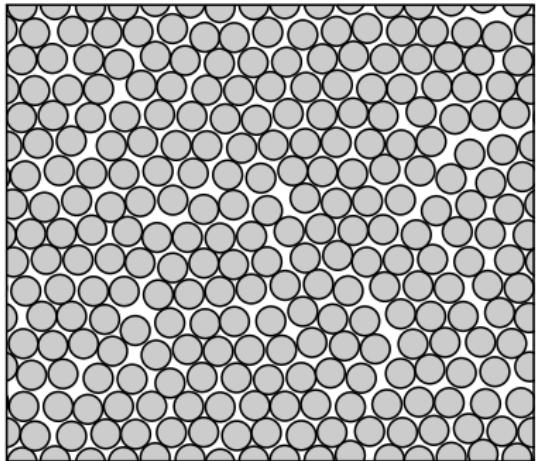
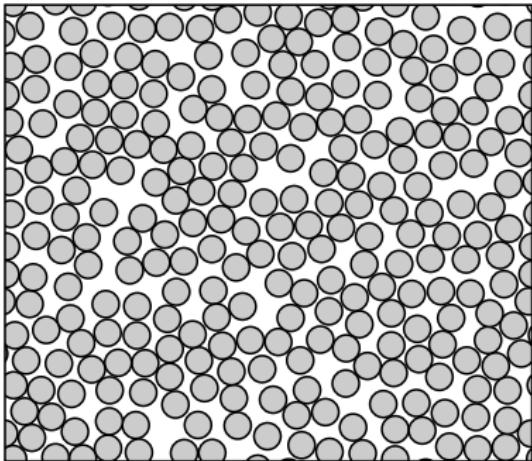
Computational statistical physics: The example of hard spheres



Paris, France, June 4th, 2004, N° 3



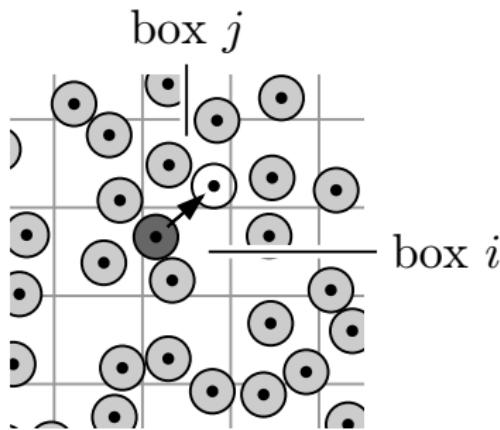
# Large systems of hard spheres



- Liquid–Solid phase transition in dimensions 2 or higher.



# Complexity of the Markov-chain algorithm



- Use of boxes imposes itself for  $N \gg 100$  (production phase of program)
- useful in all *local* problems



Have choice between

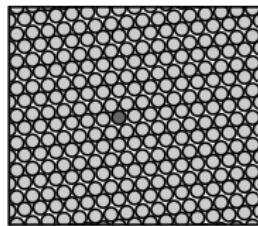
- occupation tables ('chemist's cabinets')
- Linked lists ('butcher's hooks')

Allows to handle

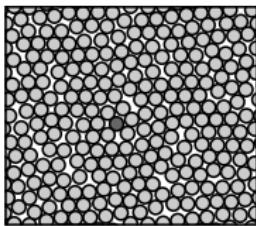
- interaction partners
- move of particle



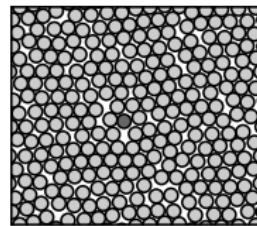
# Convergence problems of the local algorithm



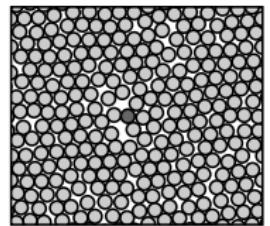
$i = 0$



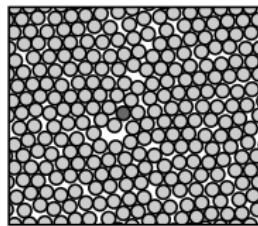
$i/N = 1000$



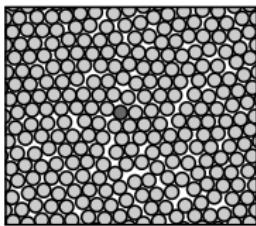
$i/N = 2000$



$i/N = 3000$

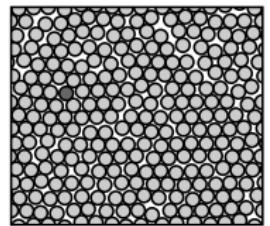


$i/N = 4000$



$i/N = 5000$

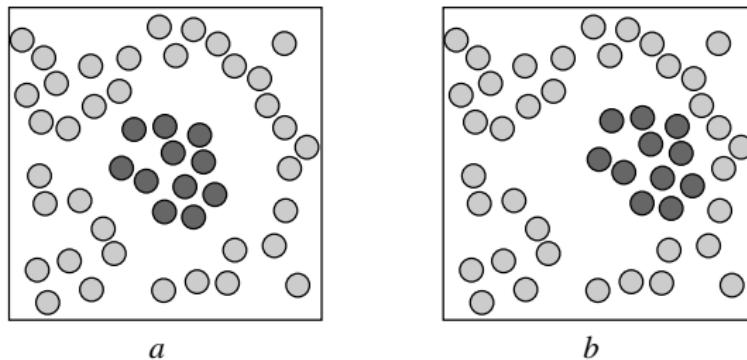
...



$i/N = 100000000$



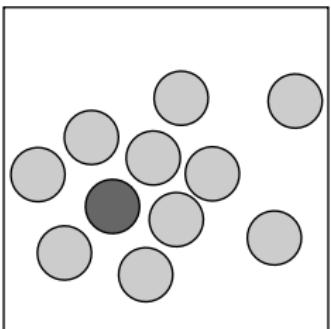
# Collective moves



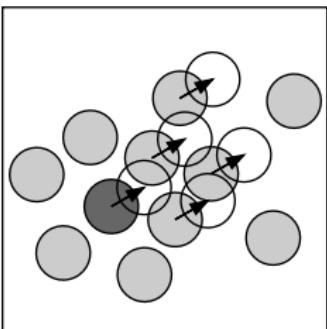
- satisfy detailed balance?
- identify clusters?



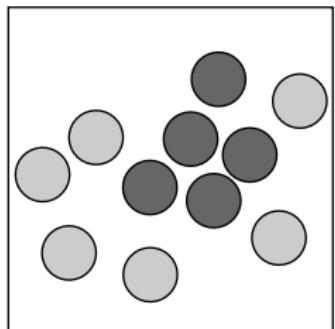
# Avalanches



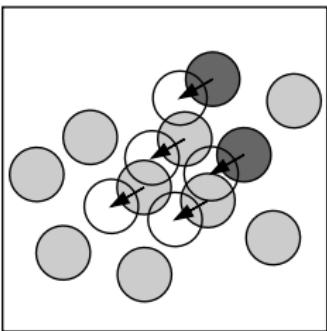
*a*



*a* (+ move)



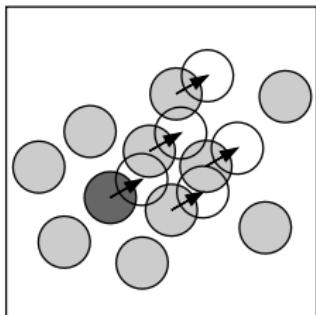
*b*



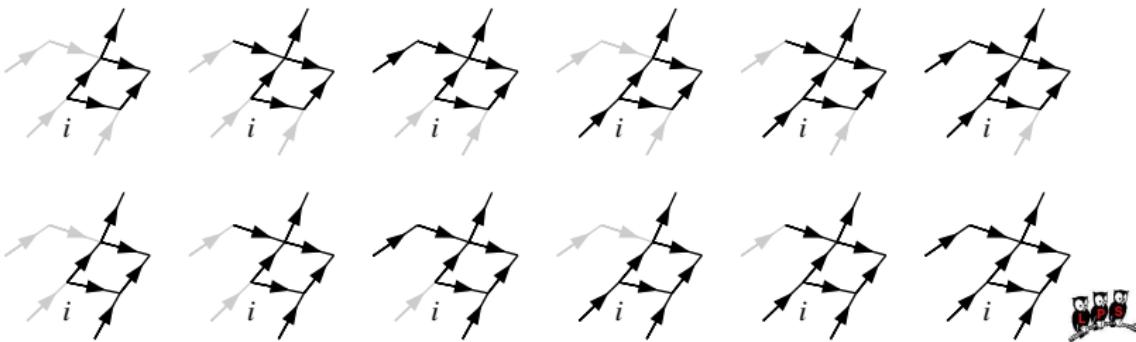
return move



# Avalanches—full analysis



$a$  (+ move)



# Avalanches—full analysis II

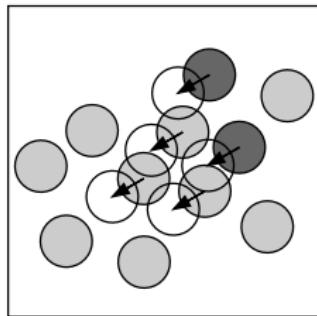


- Implies that the a priori probability of move  $a \rightarrow b$  is  $1/12$ .

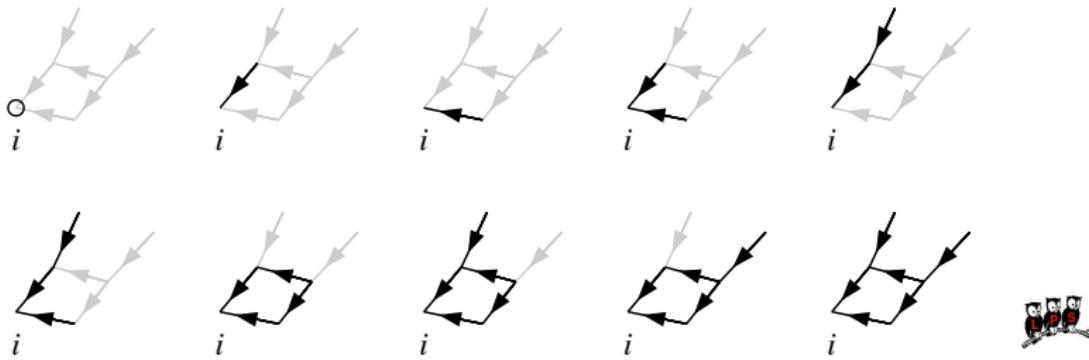
$$\mathcal{A}(a \rightarrow b) = \frac{1}{12}$$



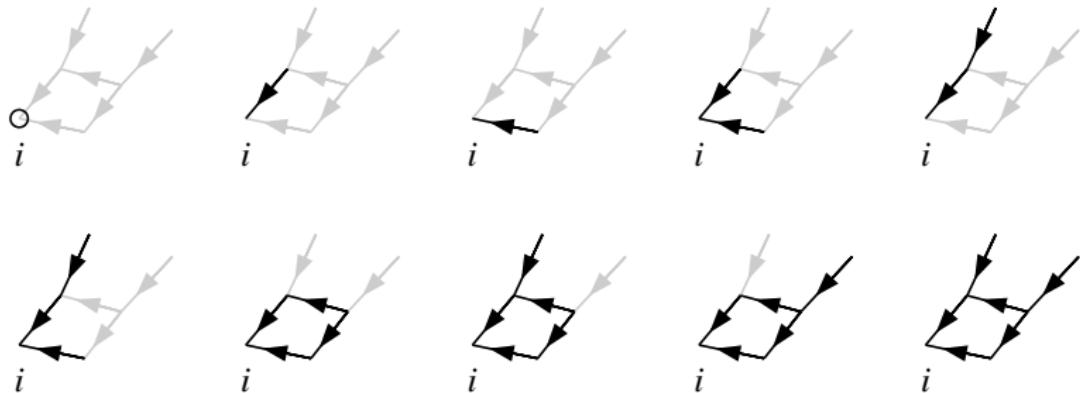
# Avalanches—full analysis (return move)



return move



# Avalanches—full analysis II (return)

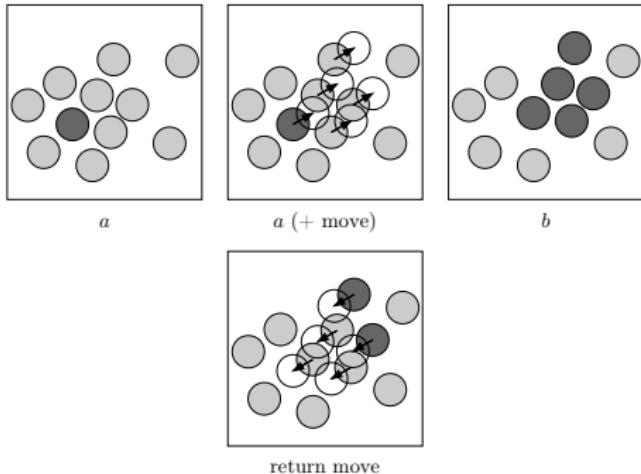


- Implies that the a priori probability of the return move  $b \rightarrow a$  is  $1/10$ .

$$\mathcal{A}(a \rightarrow b) = \frac{1}{12}$$



# Avalanches (conclusion)

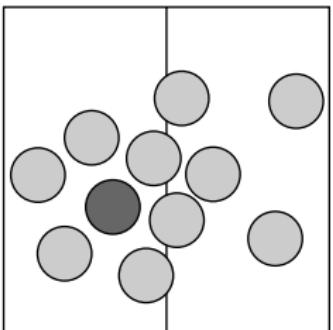


- Accept move  $a \rightarrow b$  with probability

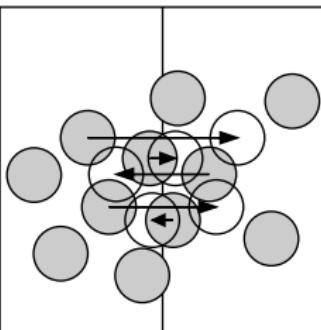
$$p(a \rightarrow b) = \min \left[ 1, \frac{12}{10} \right]$$



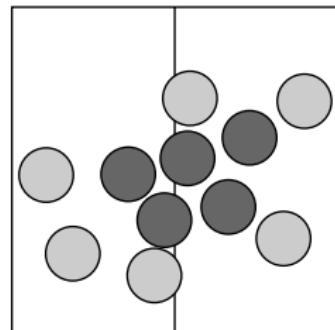
# Pivot Cluster algorithm



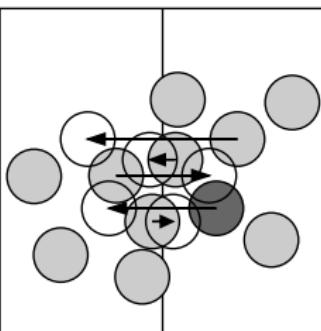
*a*



*a* (+ move)



*b*



return move



# Pivot Cluster algorithm (properties)

- each move its own inverse!
- **random** reflection, point transformations, etc
- Acceptance probability = 1

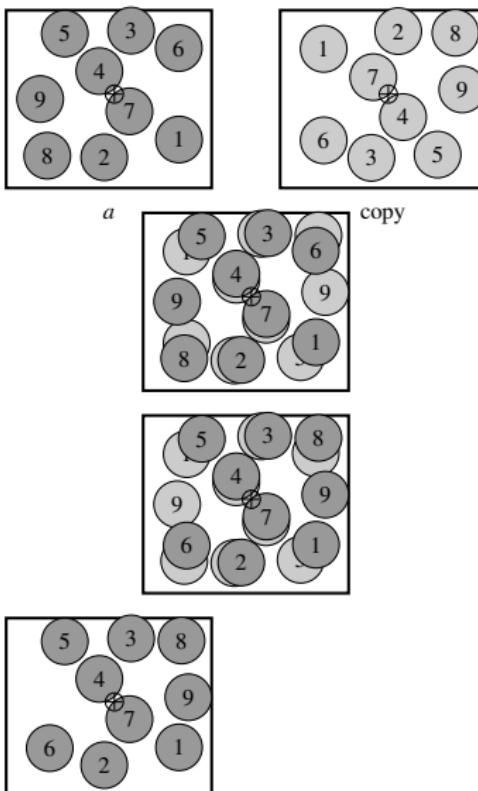


# Pivot cluster algorithm (implementation)

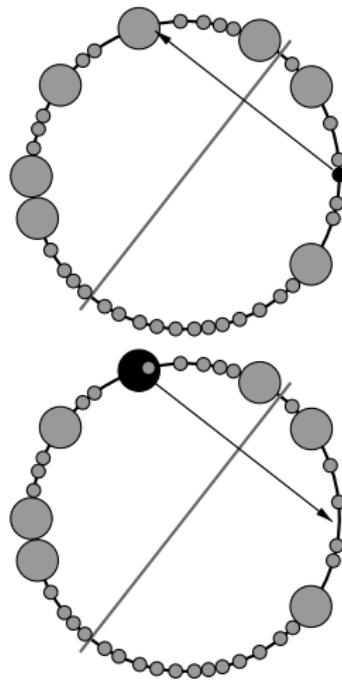
```
procedure pocket-disks
input  $\{\mathbf{x}_1, \dots, \mathbf{x}_N\}$ 
 $\mathcal{T} \leftarrow$  random symmetry operation
 $i \leftarrow \text{Nran}[1, N]$  (random initial particle)
 $\mathcal{P} \leftarrow \{i\}$ 
 $\mathcal{A} \leftarrow \{1, \dots, N\} \setminus \{i\}$ 
while ( $\mathcal{P} \neq \{\}$ ) do
     $i \leftarrow$  any element of  $\mathcal{P}$ 
     $\mathcal{P} \leftarrow \mathcal{P} \setminus \{i\}$ 
     $\mathbf{x}_i \leftarrow \mathcal{T}(\mathbf{x}_i)$ 
    for  $\forall j \in \mathcal{A}$  do
        if ( $j \cap i$ )
             $\mathcal{A} \leftarrow \mathcal{A} \setminus \{j\}$ 
             $\mathcal{P} \leftarrow \mathcal{P} \cup \{j\}$ 
output  $\{\mathbf{x}_1, \dots, \mathbf{x}_N\}$ 
```



# alternative representation of pivot cluster algorithm



# Algorithm in one dimension

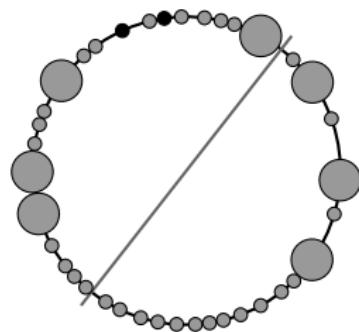
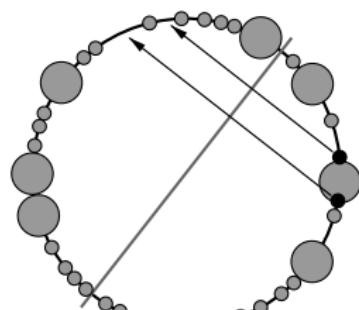


- ... (continued on next page)

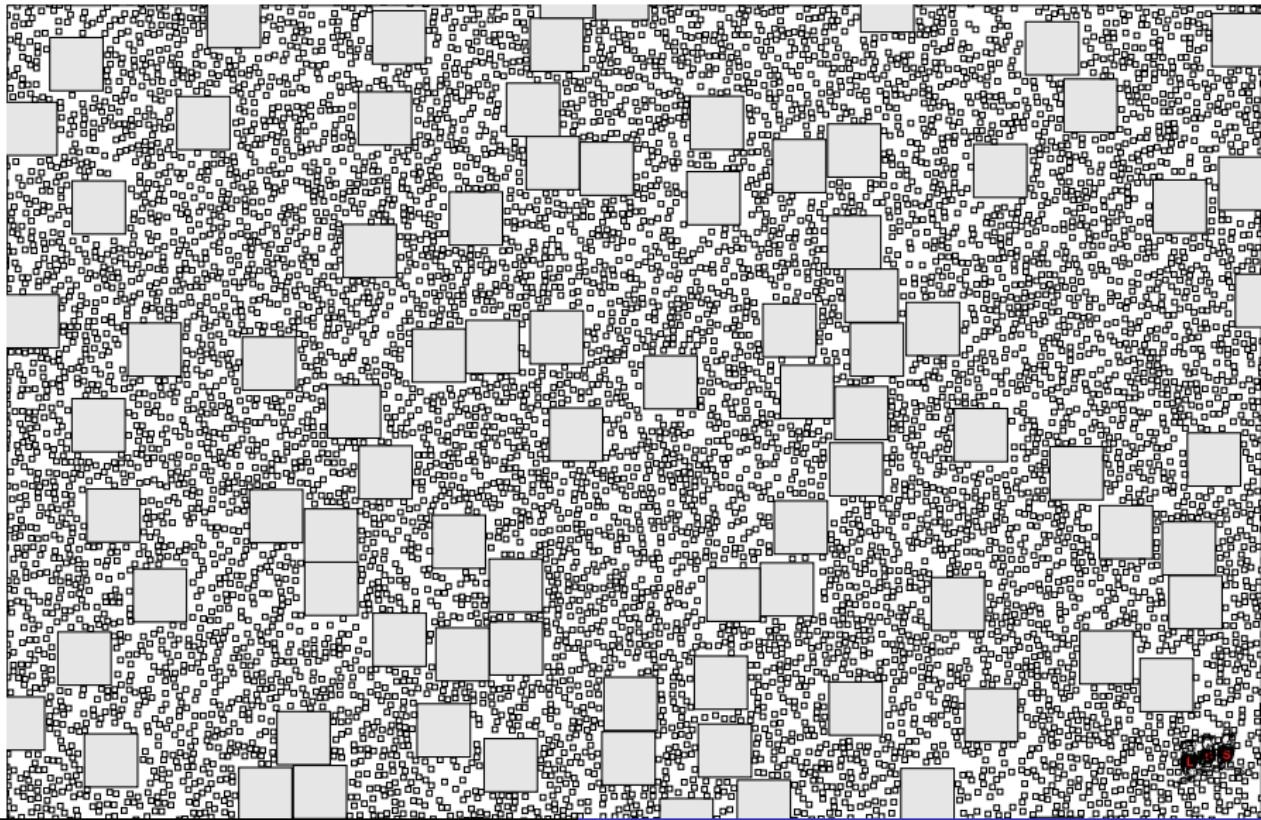


# Algorithm in one dimension

- ... (continued from last frame)



# Binary mixture (detail)



# Binary mixtures

