Efficient algorithms for hard spheres and related systems, Applications

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http://cours-physique.lps.ens.fr/ index.php/Bad\_Honnef\_Lecture\_2012



• A molecular dynamics algorithm for hard disks:



- ... starting point of Molecular dynamics, in 1957 ...
- ... converges towards thermal equilibrium.



### Markov-chain Monte Carlo ('Boltzmann')

• A local Markov-chain Monte Carlo algorithm for hard disks:



...starting point of Markov chain Monte Carlo, in 1953
...converges towards thermal equilibrium.



### 2D melting transition



- generic 2D systems cannot crystallize yet they can turn solid (Alder & Wainwright, 1962) ...
- ...nature of transition long disputed (first order vs. KTHNY (1973-1979))



density  $\eta = 0.48$ 

density  $\eta = 0.72$ 

Phase	positional order	orientational order
liquid	short-ranged	short-ranged
hexatic	short-ranged	algebraic
solid	algebraic	long-ranged



### Correlation time in larger simulations



•  $\tau$  exists, but it is large ( $\tau \gg 25\,600\,000\,000$ ).



- rejection-free
- detailed balance OK ( $heta \in [0, 2\pi]$ )
- Bernard, Krauth, Wilson PRE (2009)
- see lecture webpage



### Faster algorithm: Event-chain



- rejection-free
- detailed balance OK ( $\theta \in [0, 2\pi]$ )
- Bernard, Krauth, Wilson PRE (2009)



### Breaking detailed balance



• ... speeds up event-chain algorithm ...



### Generalization for stepped/smooth potentials



- Microcanonical version, breaking detailed balance
- faster than local Monte Carlo
- Python example code (on WK home page)
- infinite # of steps possible (see home page)
- see lecture webpage



# Configurations (1/5)





# Configurations (2/5)





### Configurations (3/5)





## Configurations (4/5)





### Configurations (5/5)





### Correlation times





### Phase separation





### Phase separation (other color code)



- circular color code
- by D. Fiocco



### Equation of state





### Synopsis of orientations and densities



- Upper: Orientations.
- Lower: Coarse-grained densities.
- Bernard, Krauth, PRL (2011)



Phase	positional order	orientational order
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### Spatial correlations at $\eta = 0.718$ (sample-averaged)



• Bernard, Krauth, PRL (2011)



Correlation times (2/2)



- Exact time of decorrelation can be computed
- This is the issue of "perfect sampling"



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