## **Worm Algorithm for large-scale QMC simulations in continuous space**

#### **Massimo Boninsegni**

Department of Physics University of Alberta



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

### Collaborators



Nikolay Prokof'ev UMass, Amherst



Boris Svistunov UMass, Amherst







Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### **Powerful approach to Monte Carlo simulations of many-body systems**

• D. M. Ceperley, Rev. Mod. Phys. **67**, 295 (1995)



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### **Powerful approach to Monte Carlo simulations of many-body systems**

- D. M. Ceperley, Rev. Mod. Phys. **67**, 295 (1995)
	- **Accurate**: *no* adjustable parameter (microscopic Hamiltonian *only* input)
	- **Unbiased**: *no* a priori assumption needed (e.g., trial wave function)
	- **Numerically exact** for Bose systems
	- Allows direct computation of most thermodynamic quantities of interest
		- Energetics and structure
		- Superfluid density and condensate fraction
		- Imaginary-time correlations



#### **Powerful approach to Monte Carlo simulations of many-body systems**

- D. M. Ceperley, Rev. Mod. Phys. **67**, 295 (1995)
	- **Accurate**: *no* adjustable parameter (microscopic Hamiltonian *only* input)
	- **Unbiased**: *no* a priori assumption needed (e.g., trial wave function)
	- **Numerically exact** for Bose systems
	- Allows direct computation of most thermodynamic quantities of interest
		- Energetics and structure
		- Superfluid density and condensate fraction
		- Imaginary-time correlations

#### **Shortcomings**:

**Efficiency**:

- sampling of many-particle permutation scales unfavorably with system size
- **Canonical ensemble** only
- No **simultaneous** evaluation of diagonal and off-diagonal correlations



#### **Powerful approach to Monte Carlo simulations of many-body systems**

- D. M. Ceperley, Rev. Mod. Phys. **67**, 295 (1995)
	- **Accurate**: *no* adjustable parameter (microscopic Hamiltonian *only* input)
	- **Unbiased**: *no* a priori assumption needed (e.g., trial wave function)
	- **Numerically exact** for Bose systems
	- Allows direct computation of most thermodynamic quantities of interest
		- Energetics and structure
		- Superfluid density and condensate fraction
		- Imaginary-time correlations

#### **Shortcomings**:

**Efficiency**:

- sampling of many-particle permutation scales unfavorably with system size
- **Canonical ensemble** only
- No **simultaneous** evaluation of diagonal and off-diagonal correlations

**Worm Algorithm**: addresses and solves above issues





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Basics of Worm Algorithm**



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Basics of Worm Algorithm** About *Ira* and *Masha*



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### **Basics of Worm Algorithm** About *Ira* and *Masha* Monte Carlo sampling moves



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### **Basics of Worm Algorithm**

About *Ira* and *Masha*

Monte Carlo sampling moves

Canonical and Grand Canonical Implementations



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Basics of Worm Algorithm** About *Ira* and *Masha* Monte Carlo sampling moves Canonical and Grand Canonical Implementations

**Applications**:



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Basics of Worm Algorithm** About *Ira* and *Masha* Monte Carlo sampling moves Canonical and Grand Canonical Implementations

**Applications**: **Superfluid transition in 4He**



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Basics of Worm Algorithm** About *Ira* and *Masha* Monte Carlo sampling moves Canonical and Grand Canonical Implementations

**Applications**:

### **Superfluid transition in 4He**

**Superfluidity** at or near extended defects in solid He



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

### **Basics of Worm Algorithm**

About *Ira* and *Masha* Monte Carlo sampling moves Canonical and Grand Canonical Implementations

**Applications**:

### **Superfluid transition in 4He**

**Superfluidity** at or near extended defects in solid He **Importance of exchanges** at phase boundaries



**Basics of Worm Algorithm** About *Ira* and *Masha* Monte Carlo sampling moves Canonical and Grand Canonical Implementations

**Applications**:

**Superfluid transition in 4He Superfluidity** at or near extended defects in solid He **Importance of exchanges** at phase boundaries

**Open Issues**





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Goal**: obtaining accurate thermodynamics for many-particle systems  $\circ$ 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Goal**: obtaining accurate thermodynamics for many-particle systems  $\circ$
- Feynman's **space-time** formulation of quantum statistical mechanics



- **Goal**: obtaining accurate thermodynamics for many-particle systems  $\circ$
- Feynman's **space-time** formulation of quantum statistical mechanics
	- *Statistical Mechanics: A set of Lectures*, Addison-Wesley (1972)



- **Goal**: obtaining accurate thermodynamics for many-particle systems
- Feynman's **space-time** formulation of quantum statistical mechanics
	- *Statistical Mechanics: A set of Lectures*, Addison-Wesley (1972)
- **Thermal averages** of physical operators at finite temperature *T =* 1*/β*



- **Goal**: obtaining accurate thermodynamics for many-particle systems
- Feynman's **space-time** formulation of quantum statistical mechanics
	- *Statistical Mechanics: A set of Lectures*, Addison-Wesley (1972)

**Thermal averages** of physical operators at finite temperature *T =* 1*/β*

$$
\langle \hat{\mathcal{O}} \rangle = \frac{\text{Tr}(\hat{\mathcal{O}}\hat{\rho})}{\text{Tr}\hat{\rho}} = \frac{\int dR \; \mathcal{O}(R) \; \rho(R,R,\beta)}{\int dR \; \rho(R,R,\beta)}
$$

 $\rho(R, R, \beta) = \langle R | e^{-\beta \hat{K}} | R \rangle$  many-body density matrix  $|R\rangle \equiv |\mathbf{r}_1 ... \mathbf{r}_N\rangle$  system configuration  $\hat{K} = \hat{H} - \mu \hat{N}$  *grand canonical Hamiltonian*  $Z = \int dR \rho(R, R, \beta)$  grand partition function



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Basic strategy**: Many-body density matrix **not known**  $\mathbf{O}$ for any non-trivial many-body system
	- Obtained through **path integration** (R. P. Feynman, 1953).

$$
Z = \int \mathcal{D}R(u) \, \exp\left[-\frac{1}{\hbar}S[R(u)]\right]
$$





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Basic strategy**: Many-body density matrix **not known** for any non-trivial many-body system
	- Obtained through **path integration** (R. P. Feynman, 1953).

$$
Z = \int \mathcal{D}R(u) \, \exp\left[-\frac{1}{\hbar}S[R(u)]\right]
$$



- *uh* "*imaginary time*"  $(k_B = 1 \text{ here})$  $\circ$
- **Integration** over all possible continuous, *β-*periodic many-particle paths  $\circ$

$$
S[R(u)] = \int_0^{\beta \hbar} du \left\{ \sum_{i=1}^N \frac{m}{2\hbar^2} \left( \frac{d\mathbf{r}_i}{du} \right)^2 + V(R(u)) \right\}
$$



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Basic strategy**: Many-body density matrix **not known** for any non-trivial many-body system
	- Obtained through **path integration** (R. P. Feynman, 1953).

$$
Z = \int \mathcal{D}R(u) \, \exp\left[-\frac{1}{\hbar}S[R(u)]\right]
$$



- *uh* "*imaginary time*"  $(k_B = 1 \text{ here})$  $\circ$
- **Integration** over all possible continuous, *β-*periodic many-particle paths  $\circ$

$$
S[R(u)] = \int_0^{\beta \hbar} du \left\{ \sum_{i=1}^N \frac{m}{2\hbar^2} \left( \frac{d\mathbf{r}_i}{du} \right)^2 + V(R(u)) \right\}
$$

- **Euclidean Action** *S* associated to path balance between *kinetic* (path curvature)  $\mathsf O$ and *potential* energy (depends on interactions) along path
	- **Smooth**, straight paths have generally **higher** probability
	- Paths of **high potential energy** have **low** probability

Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

UNIVERSITY OF  $RFR$ 

## Quantum Statistics



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

## Quantum Statistics



**Example** 4 particles in 1d

Exchanges occur *only* through PBC

*x*



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

## Quantum Statistics



**Example** 4 particles in 1d

Exchanges occur *only* through PBC

#### **Paths** are  $\beta$ -periodic, i.e.,  $R(\beta)=R(0)$

- However, individual particle positions can undergo **exchanges**
- **Crucial** ingredient of the physics of ensembles of indistinguishable particles
- Underlie phenomena such as **BEC and Superfluidity**
- Ascribing *physical content* to paths is tempting but *dangerous*



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sample many-particle paths** *R*(*u*) through configuration space, based on the probability distribution proportional to  $exp[-S(R(u))/\hbar]$  -- **Metropolis Algorithm** 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sample many-particle paths** *R*(*u*) through configuration space, based on the probability distribution proportional to  $exp[-S(R(u))/\hbar]$  -- **Metropolis Algorithm** 

**Evaluate thermal expectation values** as *statistical* averages of quantities of interest computed along paths



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sample many-particle paths** *R*(*u*) through configuration space, based on the probability distribution proportional to  $exp[-S(R(u))/\hbar]$  -- **Metropolis Algorithm** 

- **Evaluate thermal expectation values** as *statistical* averages of quantities of interest computed along paths
- $\circ$  Action integral must be **discretized**  $\rightarrow$  time step error inevitable in continuum



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sample many-particle paths** *R*(*u*) through configuration space, based on the probability distribution proportional to  $exp[-S(R(u))/\hbar]$  -- **Metropolis Algorithm** 

- **Evaluate thermal expectation values** as *statistical* averages of quantities of interest computed along paths
- Action integral must be **discretized** → time step error inevitable in continuum
	- Discretization:  $R(u) \equiv \{R_0, R_1, ..., R_{M-1}\}, R_M \equiv PR_0$ (*P permutation of particle labels*)  $M\tau = \beta$ ,  $\tau$  is the *time step* Simplest approximate action (we can do better but it is not needed now):

$$
S[R(u)] \approx \sum_{i=1}^{N} \sum_{l=0}^{P-1} \frac{m(\mathbf{r}_{il} - \mathbf{r}_{il+1})^2}{2\tau\hbar^2} + \tau \sum_{l} V(R_l)
$$

(*Note*: in the absence of interaction any discretized form is *exact*)

Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Wednesday, 26 June, 13

UNIVERSITY OF

.RF

## Discrete Action



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013
# Discrete Action

**Probability** with which a *discrete* path *R*(*u*) is sampled



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

## Discrete Action

**Probability** with which a *discrete* path *R*(*u*) is sampled

$$
P \propto \exp\left[-S[R(u)]\right] = \prod_{i=1}^{N} \prod_{l=0}^{M-1} \rho_{\circ}(\mathbf{r}_{il}, \mathbf{r}_{il+1}, \tau) \times \prod_{l=0}^{M-1} e^{-\tau V(R_l)}
$$

where

$$
\rho_{\text{o}}(\mathbf{r}, \mathbf{r}', \tau) = \left(2\pi\hbar^2\tau/m\right)^{-1/d} \exp\left[-\frac{m(\mathbf{r} - \mathbf{r}')^2}{2\hbar^2\tau}\right]
$$

is the density matrix of a *free particle*, and

$$
V(R) = U(R, \tau) - \mu N
$$

In the simplest version, U is the *total potential energy*, does not depend on  $\tau$ (In some approximations, it does)



**NIVERSITY OF** 

RF



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sampling** through elementary move that modifies portions of single-particle paths

• Permutations are sampled by *explicit construction of permutation cycles*







**Sampling** through elementary move that modifies portions of single-particle paths

• Permutations are sampled by *explicit construction of permutation cycles*





#### **Sampling issues**

• In the presence of *repulsive, hard core potentials*, any such sampling of permutations is bound to become inefficient (*high likelihood of rejection*)



**Sampling** through elementary move that modifies portions of single-particle paths

• Permutations are sampled by *explicit construction of permutation cycles*





#### **Sampling issues**

• In the presence of *repulsive, hard core potentials*, any such sampling of permutations is bound to become inefficient (*high likelihood of rejection*)

#### **Problems**

- **Superfluid fraction** connected to *winding* of paths through boundaries
- Occurrence of *nonzero* winding requires *macroscopic* permutation cycles (length ~ *N*1/*d*)
- Effort required to sample macroscopic permutation cycles scales **exponentially** with *N*
- Extrapolation of results to thermodynamic limit problematic
- Even for finite systems (quantum droplets), efficient sampling of permutations can be crucial
- Ambiguous interpretation of results (*no* superfluidity *or* ergodicity problem ?)

## Worm Algorithm (of *Ira* and *Masha*)





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

## Worm Algorithm (of *Ira* and *Masha*)



Generalize configuration space, from that of the partition function to that of the **Matsubara Green function** 

$$
G(\mathbf{r}_1, \mathbf{r}_2, t) = \frac{g(\mathbf{r}_1, \mathbf{r}_2, t)}{Z} = -\langle \hat{\mathcal{T}}[\hat{\psi}(\mathbf{r}_1, t) \hat{\psi}^{\dagger}(\mathbf{r}_2, 0)] \rangle
$$



# Worm Algorithm (of *Ira* and *Masha*)



Generalize configuration space, from that of the partition function to that of the **Matsubara Green function** 

$$
G(\mathbf{r}_1, \mathbf{r}_2, t) = \frac{g(\mathbf{r}_1, \mathbf{r}_2, t)}{Z} = -\langle \hat{\mathcal{T}}[\hat{\psi}(\mathbf{r}_1, t) \hat{\psi}^{\dagger}(\mathbf{r}_2, 0)] \rangle
$$

**One open world line** with two dangling ends (*worm*)

- *Z-* and *G-*sectors are identified
- Sampling of paths occurs through simple set of complementary moves









$$
P_{\rm op} = \min\left\{1, \, \frac{C \, m_{\rm o} N M \, e^{\Delta U - \mu m \tau}}{\rho_{\rm o}(\mathbf{r}_I, \mathbf{r}_M, m \tau)}\right\}
$$

$$
P_{\rm cl} = \min\left\{1, \frac{\rho_{\rm o}(\mathbf{r}_I, \mathbf{r}_M, m\tau)e^{\Delta U + \mu m \tau}}{Cm_{\rm o}NM}\right\}
$$

 $Z$ 



 $\tilde{\phantom{a}}$ 

 $\hat{\mathcal{S}}$ 



 $\tilde{\phantom{a}}$ 

 $\hat{\mathcal{S}}$ 

 $Z$ 



 $\overline{\phantom{a}}$ 

 $\mathbf{x} = \mathbf{y}$  , where  $\mathbf{y} = \mathbf{y}$ 

 $Z$ 





















Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Configurations with open WL contribute to the **Matsubara Green function**



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Configurations with open WL contribute to the **Matsubara Green function**

• All **non-trivial topological path updates** occur in G-sector



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Configurations with open WL contribute to the **Matsubara Green function**

• All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- Configurations with open WL contribute to the **Matsubara Green function**
	- All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials

When *Ira* and *Masha* reconnect, a *Z-*sector configuration is obtained, and most observables computed -- large permutation cycles *automatically occur*



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- Configurations with open WL contribute to the **Matsubara Green function**
	- All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials

- When *Ira* and *Masha* reconnect, a *Z-*sector configuration is obtained, and most observables computed -- large permutation cycles *automatically occur*
- **Reconnection is one of the attempted moves** (no need to wait for it !)



- Configurations with open WL contribute to the **Matsubara Green function**
	- All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials

- When *Ira* and *Masha* reconnect, a *Z-*sector configuration is obtained, and most observables computed -- large permutation cycles *automatically occur*
- **Reconnection is one of the attempted moves** (no need to wait for it !)
- Number of particles fluctuate (*canonical implementations possible*)



- Configurations with open WL contribute to the **Matsubara Green function**
	- All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials

- When *Ira* and *Masha* reconnect, a *Z-*sector configuration is obtained, and most observables computed -- large permutation cycles *automatically occur*
- **Reconnection is one of the attempted moves** (no need to wait for it !)
- Number of particles fluctuate (*canonical implementations possible*)

Can I and M get "stuck" away from each other?



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- Configurations with open WL contribute to the **Matsubara Green function**
	- All **non-trivial topological path updates** occur in G-sector

**Swap moves** enjoy relatively high acceptance, even with hard core potentials

- When *Ira* and *Masha* reconnect, a *Z-*sector configuration is obtained, and most observables computed -- large permutation cycles *automatically occur*
- **Reconnection is one of the attempted moves** (no need to wait for it !)
- Number of particles fluctuate (*canonical implementations possible*)

#### Can I and M get "stuck" away from each other?

Statistics of spatial distances between *I* and *M* given by *one-body density matrix*

- Decaying exponentially in a non-BEC
- Going to a constant in a BEC (but high acceptance probability of reconnection)

#### Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

UNIVERSITY OF **RER** 

#### **Example:** 4He in two dimensions, *T*=0.6 K





## Application: Superfluid Transition in 4He



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**NIVERSITY OF** 

**RERTA** 

## Superfluid Transition in 4He (cont'd)





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013
#### Superfluid Transition in 4He (cont'd)





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

# Superfluid Transition in 4He (cont'd)





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### Application: Search for BEC in Solid 4He MB, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **96**, 105301 (2006)



**Exponential** decay of one-body density matrix seen at low *T*, large *r* for perfect hcp 4He crystal

**Absence of BEC** Independent of pressure

**Absence of SF** No long permutation cycles



#### Application: vacancies in Solid 4He

MB, A. Kuklov, L. Pollet, N. Prokof'ev, B. Svistunov and M. Troyer, PRL **97**, 080401 (2006)

Activation energy for vacancies and interstitials can be obtained straightforwardly from **exponential decay** of **Matsubara Green function**





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Application: Possible superfluidity at grain boundaries in solid 4He

L. Pollet, MB, A. Kuklov, N. Prokof'ev, B. Svistunov and M. Troyer, Phys. Rev. Lett. **98**, 135301 (2007).

- $\circ$  By direct simulation, evidence is obtained that  $L_z$ a grain boundary in direct contact with a superfluid at the melting pressure is **thermodynamically stable**.
- Superfluid behavior of a generic GB at temperatures of the order of 0.5 K is observed. Indeed, a **generic GB is found to be superfluid**, although insulating GBs exist as well, for particular relative orientations of the crystallites.
- Simulations performed on systems including as many as **13,000** particles (*yes, that many are needed*)







Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

#### Application: Possible superfluidity in the core of a screw dislocation in solid 4He

MB, A. Kuklov, L. Pollet, N. Prokof'ev, B. Svistunov and M. Troyer, Phys. Rev. Lett. **99**, 035301 (2007).



Simulations of single screw dislocation inside hcp 4He crystal show evidence of spatially modulated *Luttinger liquid* (1d supersolid ?)



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

Bosons with dipole moment aligned perpendicularly to plane  $\circ$ 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

- Bosons with dipole moment aligned perpendicularly to plane  $\mathsf O$
- Natural units, inter-particle distance  $r_s$  and  $t = T/T^*$   $(T^* = 1/r_s^2)$  parameters  $\circ$



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

- Bosons with dipole moment aligned perpendicularly to plane  $\mathsf O$
- Natural units, inter-particle distance  $r_s$  and  $t = T/T^*$   $(T^* = 1/r_s^2)$  parameters  $\circ$

 $r_s = 0.067$ ,  $t = 0.9$ 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

- Bosons with dipole moment aligned perpendicularly to plane  $\mathsf O$
- Natural units, inter-particle distance  $r_s$  and  $t = T/T^*$   $(T^* = 1/r_s^2)$  parameters  $\mathbf O$



*boltzmannons*

 $r_s = 0.067$ ,  $t = 0.9$ 

Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement



MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

- Bosons with dipole moment aligned perpendicularly to plane  $\mathsf O$
- Natural units, inter-particle distance  $r_s$  and  $t = T/T^*$   $(T^* = 1/r_s^2)$  parameters  $\mathbf O$



*boltzmannons bosons*

 $r_s = 0.067$ ,  $t = 0.9$ 

Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement

Bose system *superfluid*, as *long* cycles of exchanges of identical particles occur



MB, L. Pollet, N. Prokof'ev and B. Svistunov, Phys. Rev. Lett. **109**, 025302 (2012).

$$
\hat{H} = -\frac{1}{2} \sum_{i} \nabla_i^2 + \sum_{i < j} \frac{1}{|\mathbf{x}_i - \mathbf{x}_j|}^3
$$

- Bosons with dipole moment aligned perpendicularly to plane  $\circ$
- Natural units, inter-particle distance  $r_s$  and  $t = T/T^*$   $(T^* = 1/r_s^2)$  parameters  $\circ$



*boltzmannons bosons*

 $r_s = 0.067$ ,  $t = 0.9$ 

Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement

Bose system *superfluid*, as *long* cycles of exchanges of identical particles occur

Thermodynamic equilibrium structure *crucially* depends on quantum statistics System can lower its energy by forming a *quasi*-BEC and losing *solid* order





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Standard microscopic model, based on Aziz pair potential  $\circ$ 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- Standard microscopic model, based on Aziz pair potential  $\circ$
- *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)  $\circ$



- Standard microscopic model, based on Aziz pair potential  $\circ$
- *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)  $\bullet$



*"Bolium"* (N. Prokof'ev)



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

Standard microscopic model, based on Aziz pair potential  $\circ$ *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)



*"Bolium"* (N. Prokof'ev)

108-atom Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement



Standard microscopic model, based on Aziz pair potential  $\circ$ *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)



*"Bolium"* (N. Prokof'ev)

- 108-atom Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement
- *Spontaneous crystallization*



Standard microscopic model, based on Aziz pair potential  $\circ$ *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)  $\bullet$ 



*"Bolium"* (N. Prokof'ev)

- 108-atom Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement
- *Spontaneous crystallization*
- *Pressure near zero bars*  $\overline{O}$



Standard microscopic model, based on Aziz pair potential  $\circ$ *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)  $\bullet$ 



*"Bolium"* (N. Prokof'ev)

- 108-atom Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement
- *Spontaneous crystallization*
- *Pressure near zero bars*
- Bose system *superfluid* (uniform  $\mathbf O$ density)



Standard microscopic model, based on Aziz pair potential  $\circ$ *T* = 0.5 K, density 0.0248 Å <sup>-3</sup> (equilibrium *superfluid* phase at *P* ~ 15 bars)



*"Bolium"* (N. Prokof'ev)

- 108-atom Boltzmann system *crystallizes* regardless of cell geometry and/or initial particle arrangement
- *Spontaneous crystallization*
- *Pressure near zero bars*
- Bose system *superfluid* (uniform  $\mathbf O$ density)

Simulation results strongly suggest that 4He *would be a crystal* at this *T*, if its atoms were indeed *distinguishable*. Here too, Bose statistics strongly affects the phase diagram of this Bose system, *not just at the liquid-solid phase boundary*.





Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

**Sign problem** (neither improved not worsened by WA)  $\circ$ 



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Sign problem** (neither improved not worsened by WA)  $\mathsf{O}$ 
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Sign problem** (neither improved not worsened by WA)  $\mathsf{O}$ 
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)
- **Continuous Time** (is there any way of avoiding the time step error in continuos  $\mathsf{O}$ space ?)



- **Sign problem** (neither improved not worsened by WA)  $\mathsf{O}$ 
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)
- **Continuous Time** (is there any way of avoiding the time step error in continuos  $\circ$ space ?)
- Can run into problems whenever **multi-particle updates** are needed (e.g., at first  $\mathsf{O}$ order phase transitions)



- **Sign problem** (neither improved not worsened by WA)  $\mathsf{O}$ 
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)
- **Continuous Time** (is there any way of avoiding the time step error in continuos  $\mathsf{O}$ space ?)
- Can run into problems whenever **multi-particle updates** are needed (e.g., at first  $\circ$ order phase transitions)
- **Dynamical information** (linear response theory and analytic continuation)  $\mathbf O$



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013

- **Sign problem** (neither improved not worsened by WA)
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)
- **Continuous Time** (is there any way of avoiding the time step error in continuos space ?)
- Can run into problems whenever **multi-particle updates** are needed (e.g., at first  $\circ$ order phase transitions)
- **Dynamical information** (linear response theory and analytic continuation)  $\circ$

## Main Reference

MB, N. Prokof'ev and B. Svistunov, Phys. Rev. E **74**, 036701 (2006)



- **Sign problem** (neither improved not worsened by WA)
	- Fixed-node restriction (Ceperley, 1992) in principle applicable to WA)
- **Continuous Time** (is there any way of avoiding the time step error in continuos space ?)
- Can run into problems whenever **multi-particle updates** are needed (e.g., at first  $\circ$ order phase transitions)
- **Dynamical information** (linear response theory and analytic continuation)  $\circ$

#### Main Reference

MB, N. Prokof'ev and B. Svistunov, Phys. Rev. E **74**, 036701 (2006)

## *Thank you !*



Advances in Quantum Monte Carlo techniques Institute for Nuclear Theory, Seattle, July 2013