### Path Integral Monte Carlo Simulations of Warm Dense Matter

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### Outline

- **1. Path integral Monte Carlo simulation method**
- 2. Application of CH plastic ablator materials
- 3. Application to warm, dense silicon

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### **Phase Diagram of Hydrogen**



#### 1) Path integral Monte Carlo for T>5000K



### Path integral Monte Carlo for T>5000K Density functional molecular dynamics below





Born-Oppenheimer approx. MD with classical nuclei:

#### **F** = m a

Forces derived DFT with electrons in the instantaneous ground state.

### **Juno Mission** Now in orbit around Jupiter

- Interior model to match gravity data
- Equation of state calculations for hydrogen-helium mixtures
- Thermodynamics of heavier elements (Z)





**Mission Timeline:** 

- Launch August 2011
- Earth flyby gravity assist October 2013
- Jupiter arrived in July 2016
- End of mission much past October 2017

# **Nonte Carlo**

### Step 1 towards the path integral

Matrix squaring property of the density matrix

Matrix squaring in operator notation:

$$\hat{\rho} = e^{-\beta \hat{H}} = \left(e^{-(\beta/2)\hat{H}}\right) \left(e^{-(\beta/2)\hat{H}}\right), \quad \beta = \frac{1}{k_B T}$$

Matrix squaring in real-space notation:

$$\langle R \mid \hat{\rho} \mid R' \rangle = \int dR_1 \, \langle R \mid e^{-(\beta/2)\hat{H}} \mid R_1 \rangle \, \langle R_1 \mid e^{-(\beta/2)\hat{H}} \mid R' \rangle$$

Matrix squaring in matrix notation:

$$\begin{bmatrix} \dots & R' & \dots \\ R & \ddots & \vdots \\ \dots & \dots & \dots \end{bmatrix} = \begin{bmatrix} \dots & R_1 & \dots \\ R & \ddots & \vdots \\ \dots & \dots & \dots \end{bmatrix} * \begin{bmatrix} \dots & R' & \dots \\ R_1 & \ddots & \vdots \\ \dots & \dots & \dots \end{bmatrix}$$

### Repeat the matrix squaring step

Matrix squaring in operator notation:

$$\hat{\rho} = e^{-\beta \hat{H}} = \left(e^{-(\beta/4)\hat{H}}\right)^4, \quad \beta = \frac{1}{k_B T}$$

#### Matrix squaring in real-space notation:

$$\langle R \mid \hat{\rho} \mid R' \rangle = \int dR_1 \int dR_2 \int dR_3 \langle R \mid e^{-(\beta/4)\hat{H}} \mid R_1 \rangle \langle R_1 \mid e^{-(\beta/4)\hat{H}} \mid R_2 \rangle \langle R_2 \mid e^{-(\beta/4)\hat{H}} \mid R_3 \rangle \langle R_3 \mid e^{-(\beta/4)\hat{H}} \mid R' \rangle$$

### Path Integrals in Imaginary Time

Simplest form for the paths' action: primitive approx.

Density matrix:

$$\hat{\rho} = e^{-\beta \hat{H}} = \left(e^{-\tau \hat{H}}\right)^M, \ \beta = \frac{1}{k_B T}, \ \tau = \frac{\beta}{M}$$

$$\langle \hat{O} \rangle = \frac{\text{Tr}[\hat{O}\hat{\rho}]}{\text{Tr}[\hat{\rho}]}$$

#### M step path integral:

 $\left\langle R \mid \hat{\rho} \mid R' \right\rangle = \left\langle R \mid (e^{-\tau \hat{H}})^{M} \mid R' \right\rangle = \int dR_{1} \dots \int dR_{M-1} \left\langle R \mid e^{-\tau \hat{H}} \mid R_{1} \right\rangle \left\langle R_{1} \mid e^{-\tau \hat{H}} \mid R_{2} \right\rangle \dots \left\langle R_{M-1} \mid e^{-\tau \hat{H}} \mid R' \right\rangle$ 

#### Path integral and primitive action S:

$$\langle R \mid \hat{\rho} \mid R' \rangle = \oint_{R \to R'} dR_t e^{-S[R_t]}$$

$$S[R_t] = \sum_{i=1}^M \frac{(R_{i+1} - R_i)^2}{4\lambda\tau} + \frac{\tau}{2} \Big[ V(R_i) + V(R_{i+1}) \Big]$$

Pair action: Militzer, Comp. Phys. Comm. (2016)



### **Bosonic and Fermionic Path Integrals**

Bosonic density matrix: Sum over all symmetric eigenstates.

$$\rho_B(R, R', \beta) = \sum_i e^{-\beta E_i} \Psi_S^{[i]*}(R) \Psi_S^{[i]}(R')$$

Project out the symmetric states:

$$\rho_{B}(R,R',\beta) = \sum_{P} (+1)^{P} \rho_{D}(R,PR',\beta)$$

Fermionic density matrix: Sum over all antisymmetric eigenstates.

$$\rho_F(R,R',\beta) = \sum_i e^{-\beta E_i} \Psi_{AS}^{[i]*}(R) \Psi_{AS}^{[i]}(R')$$

Project out the antisymmetric states:

$$\rho_F(R,R',\beta) = \sum_P (-1)^P \rho_D(R,PR',\beta)$$

$$\left\langle R \mid \hat{\rho}_{F/B} \mid R' \right\rangle = \sum_{P} (\pm 1)^{P} \int dR_{1} \dots \int dR_{M-1} \left\langle R \mid e^{-\tau \hat{H}} \mid R_{1} \right\rangle \dots \left\langle R_{M-1} \mid e^{-\tau \hat{H}} \mid PR' \right\rangle$$



### **Restricted PIMC for fermions: How is the restriction applied?**



Free-particle nodes:

Construct a <u>fermionic trial density matrix</u> in form of a Slater determinant of single-particle density matrices:

$$\rho_T(R,R',\beta) = \begin{vmatrix} \rho(r_1,r_1',\beta) & \cdots & \rho(r_1,r_N',\beta) \\ \vdots & \ddots & \vdots \\ \rho(r_N,r_1',\beta) & \cdots & \rho(r_N,r_N',\beta) \end{vmatrix}$$

Enforce the following nodal condition for all time slices along the paths:

$$\rho_T[R(t), R(0), t] > 0$$

This 3N-dimensional conditions eliminates all negative and some positive contribution to the path  $\rightarrow$  Solves the fermion sign problem approx.

$$\rho_0^{[1]}(r,r';\beta) = \sum_k e^{-\beta E_k} \, \Psi_k(r) \, \Psi_k^*(r')$$

### Starting from Restricted PIMC Simulations of Hydrogen

#### PHYSICAL REVIEW LETTERS

VOLUME 73

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NUMBER 16

Equation of State of the Hydrogen Plasma by Path Integral Monte Carlo Simulation

C. Pierleoni,<sup>1,2,\*</sup> D. M. Ceperley,<sup>3</sup> B. Bernu,<sup>1</sup> and W. R. Magro<sup>3</sup>

VOLUME 76, NUMBER 8	PHYSICAL REVIEW LETTERS	19 February 1996
Molecular Dissociation in Hot, Dense Hydrogen		
W.R. Magro, <sup>1</sup> D.M. Ceperley, <sup>2</sup> C. Pierleoni, <sup>3</sup> and B. Bernu <sup>4</sup>		

### PIMC and DFT-MD Simulations of Hydrogen and Helium



### Water and Carbon

### First Path Integral Monte Carlo Simulations for Heavier Elements Fill this Gap in Temperature



### Again Path Integral Monte Carlo bridges the Gap in T between DFT-MD and the Debye Model



### Path Integral Monte Carlo bridges the Gap in Internal Energy vs Temperature for Water and Carbon Plasmas



### Path Integral Monte Carlo and DFT-MD are in very good agreement



### Study planetary interiors in the laboratory: shock wave experiments



Two-stage gas gun (Livermore) 0.2 Mbar



Nova laser (Livermore) 3.4 Mbar



Z capacitor bank (Sandia) 2 Mbar



National Ignition Facility 700 Mbar

### Shock wave measurements determine the Equation of State on the Hugoniot curve





### **PIMC** and **DFT-MD** Simulations of Nitrogen



Driver, Militzer, PRB 93, 064101 (2016)

### **PIMC** and **DFT-MD** Simulations of Nitrogen: How well do pressures and energies agree?



Driver, Militzer, PRB 93, 064101 (2016)

### Why do free-particle nodes work for PIMC simulations of first-row elements?

Core electrons are **fully ionized**. Free-particles nodes are ideal! 1s 10% occupation

2s -1s 100% occupation

25 -----

1s state doubly occupied. Others ionized. Free-particles nodes should still work.

2s + <60% occupation 1s + 100% occupation 1s 100% occupied, 2s less than 60% occupied Free-particles nodes in PIMC are accurate for T > 250,000 K for carbon and water plasmas.



100% occupation 2s 100% occupied. Free-particles nodes do no Occupation longer work but KS-DFT works!

### **PIMC** and **DFT-MD** Simulations of Nitrogen: Comparison with Experiments and Theory



Driver, Militzer, PRB 93, 064101 (2016)

### **PIMC** and **DFT-MD** Simulations of Nitrogen: Poor Agreement with Experiments by Mochalov (2010)



Driver, Militzer, PRB 93, 064101 (2016)



### Inertial confinement fusion experiments with plastic coated spheres of liquid H<sub>2</sub>



(Graphics: Bachmann et al. LLNL)

### PIMC and DFT-MD simulations performed for C<sub>2</sub>H, CH, C<sub>2</sub>H<sub>3</sub>, CH<sub>3</sub> and CH<sub>4</sub>.



### CH Shock Hugoniot Curves: Comparison of Theory and Experiments



### CH Shock Hugoniot Curves: Comparison of Theory and Experiments



### Linear Mixing Approximation works well



### Why do the C and CH Hugoniot curves differ from those for N, O and Ne?





### Path Integral Monte Carlo with localized nodal surfaces and application to silicon plasmas

How the nodes are enforced:

$$\rho_F(\mathbf{R}, \mathbf{R}'; \beta) = \frac{1}{N!} \sum_{\mathcal{P}} (-1)^{\mathcal{P}} \int \mathbf{d}\mathbf{R}_t \ e^{-S[\mathbf{R}_t]} \mathbf{R}_{\mathcal{P}} \mathbf{R}', \rho_T > 0$$

Nodes are a Slater determinant:

$$\rho_T(\mathbf{R}, \mathbf{R}'; \beta) = \left| \left| \rho^{[1]}(r_i, r'_j; \beta) \right| \right|_{ij}$$

Before we used only free-particle orbitals (plane waves):

$$\rho_0^{[1]}(r,r';\beta) = \sum_k e^{-\beta E_k} \, \Psi_k(r) \, \Psi_k^*(r')$$

New idea: Add Hartree-Fock orbitals

$$\rho^{[1]}(r,r',\beta) = \sum_{I=1}^{N} \sum_{s=0}^{n} e^{-\beta E_s} \Psi_s(r-R_I) \Psi_s^*(r'-R_I)$$



Militzer, Driver, Phys. Rev. Lett. (2015)

### New Type of PIMC Move needed: Multi-Particle Moves

- Since the nodes depend on the nuclei, need to move ions and nearby electrons at once.
- Which electrons are nearby? Use localization function:

$$L_{Ij} = \int_0^\beta dt \, |\Psi_{1s}(r_j(t) - R_I)|^2$$

- Build a table of ion-electron moves with up to 4 electrons.
- Sample from it like the permutation table.
- This led to efficient PIMC simulations.



Militzer, Driver, Phys. Rev. Lett. (2015)

### Energy and Pressure Comparison of Path Integral Monte Carlo and Kohn-Sham DFT



### Silicon: Energy and Pressure Comparison of Path Integral Monte Carlo and Kohn-Sham DFT





 $10^{7}$ 

Temperature (K)

-0.10

10<sup>6</sup>

### **Energy of isolated** silicon atom: Path **Integral Monte Carlo** and Orbital-Free DFT

Hu, Militzer, Collins, Driver, Kress, Phys. Rev. B 94 (2016) 094109

### g(r) Comparison of Path Integral Monte Carlo and Kohn-Sham DFT



Militzer, Driver, Phys. Rev. Lett. (2015)

### Energy and Pressure Comparison of Path Integral Monte Carlo & Orbital-Free DFT



Hu, Militzer, Collins, Driver, Kress, Phys. Rev. B 94 (2016) 094109

### Silicon Hugoniot Curve: Experiments and Semi-analytical EOS models



### Silicon Hugoniot Curve: Path Integral Monte Carlo, Orbital-Free DFT



### Silicon Hugoniot Curve: Average-Atom models













### Conclusions

- For elements from hydrogen to through silicon, the energy, pressure, and g(r) functions computed with PIMC and KS-DFT agree well at 2×10<sup>6</sup> K.
- Internal energy agrees to better than 5 Ha/atom. Pressure to 2%.
- So far, we could not detect any problem with the zerotemperature exchange-correlation functionals.
- We will provide more EOS data to improve orbit-free methods.
- Second row elements: More comparison between simulations and experiments
- Extending PIMC to third row elements in particular iron.

