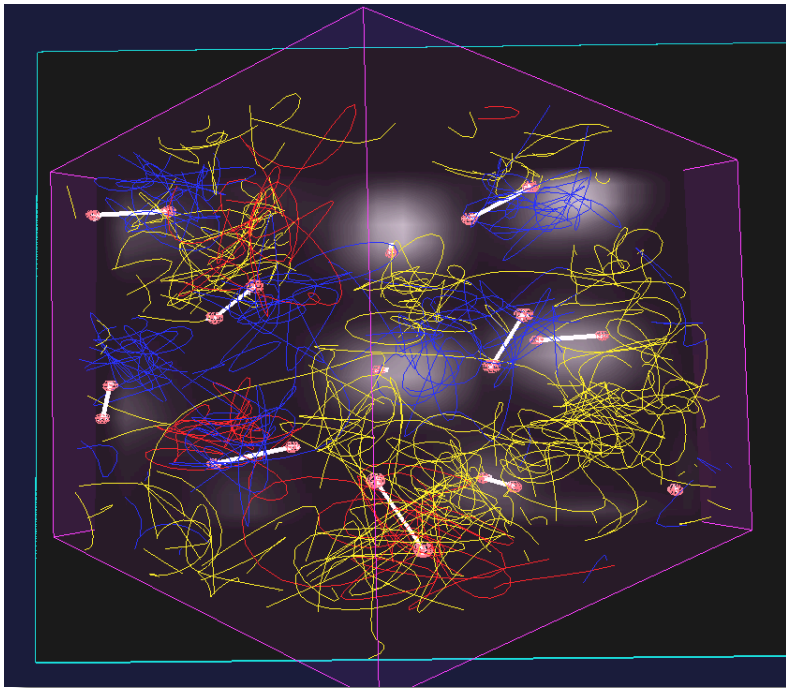


# Path Integral Monte Carlo for Fermions

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Summer school “QMC Theory and Fundamentals”



**Burkhard Militzer**

**University of California, Berkeley**

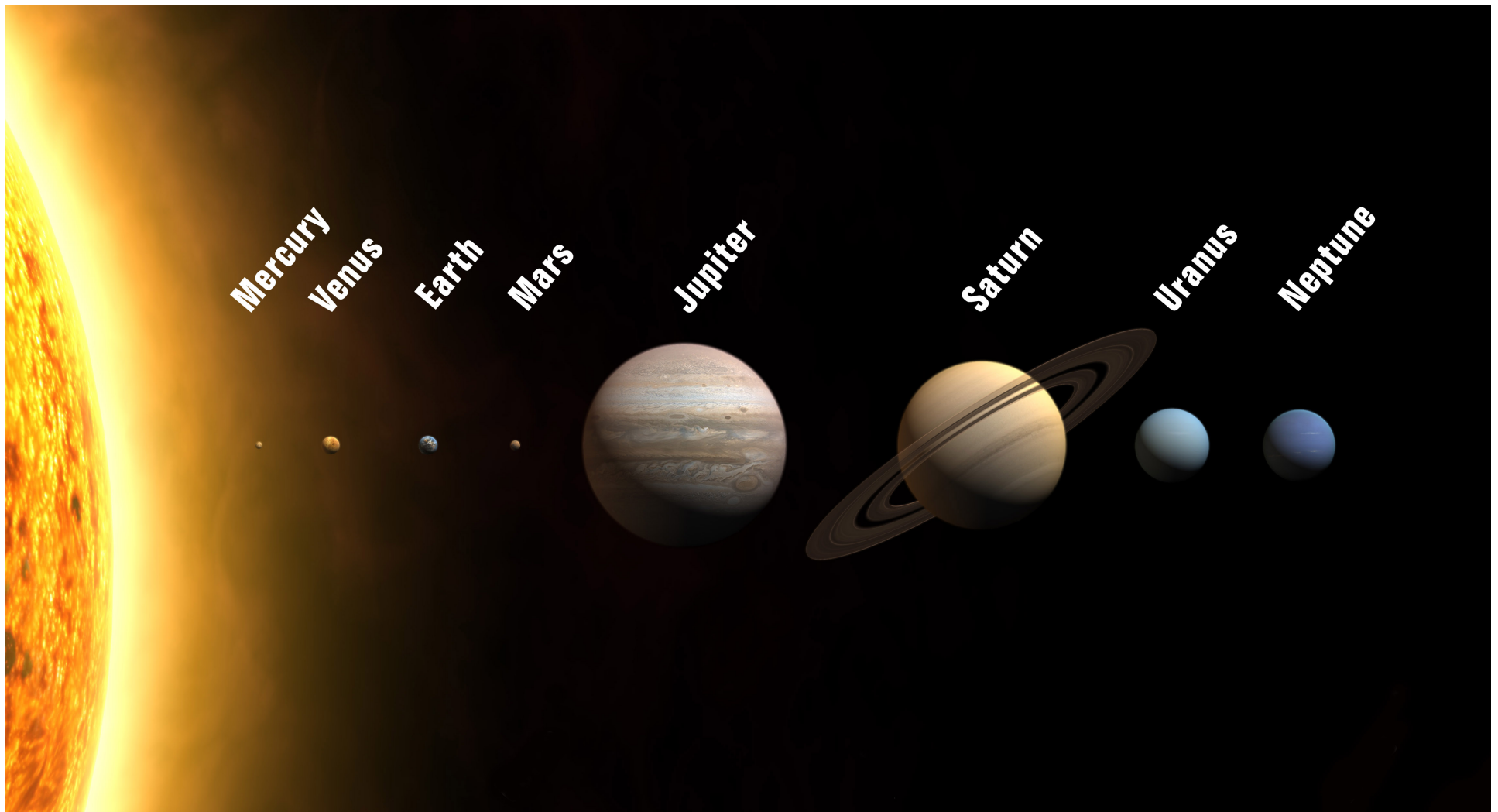
**militzer@berkeley.edu**

**<http://militzer.berkeley.edu>**

**PIMC is the best simulation method for fermions**  
**in moderately and highly excited states:**  
**Hydrogen plasma in the sun, some giant planets**  
**and for simulation of fusion processes**

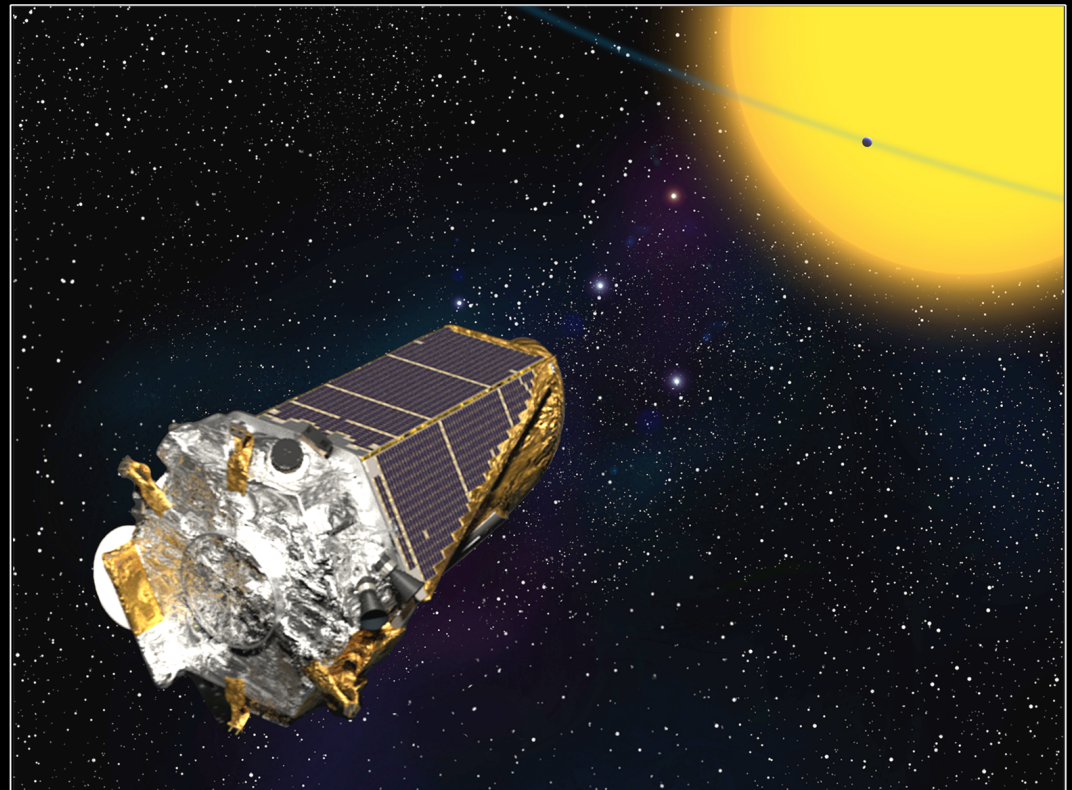
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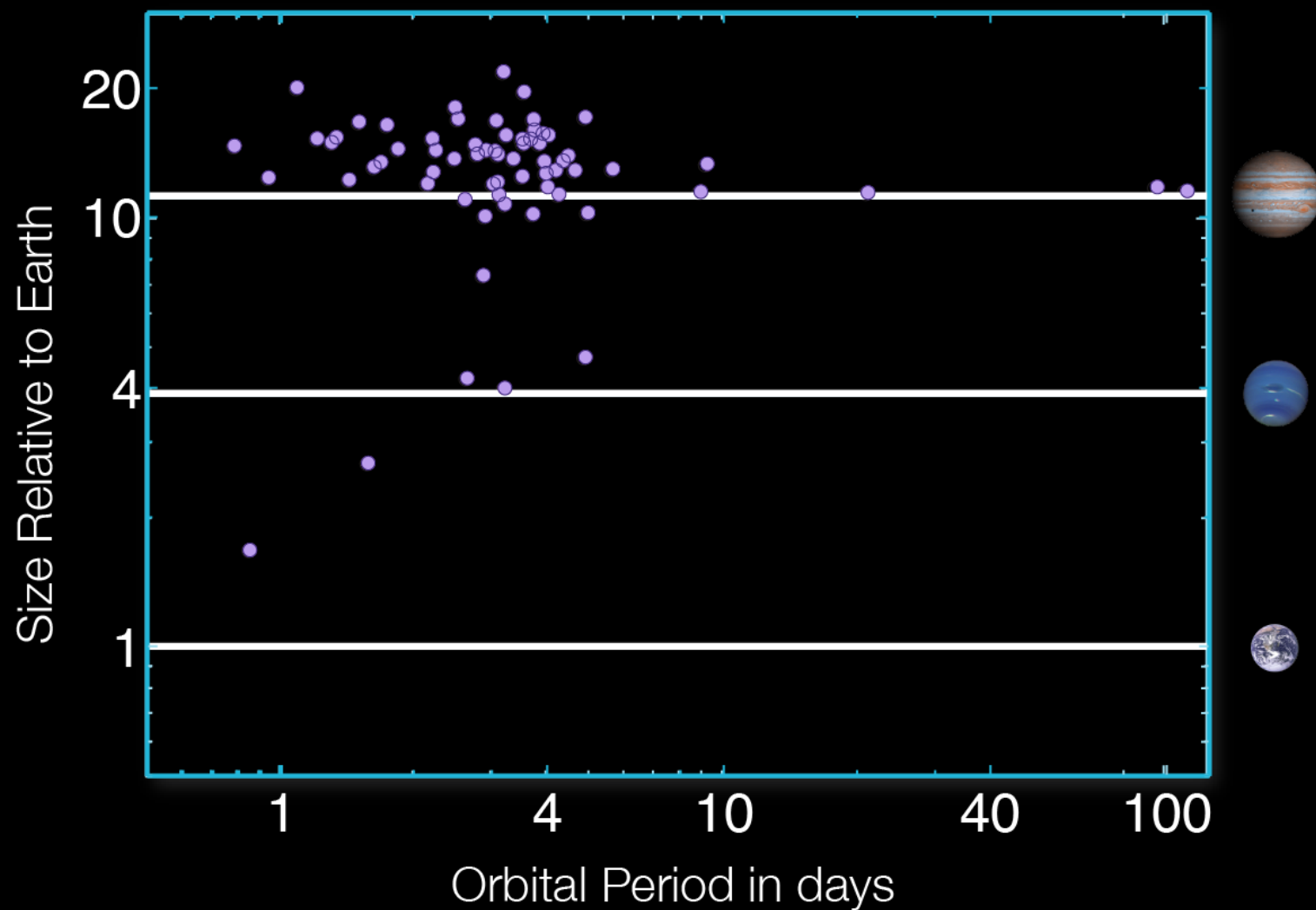


# NASA's Kepler Mission

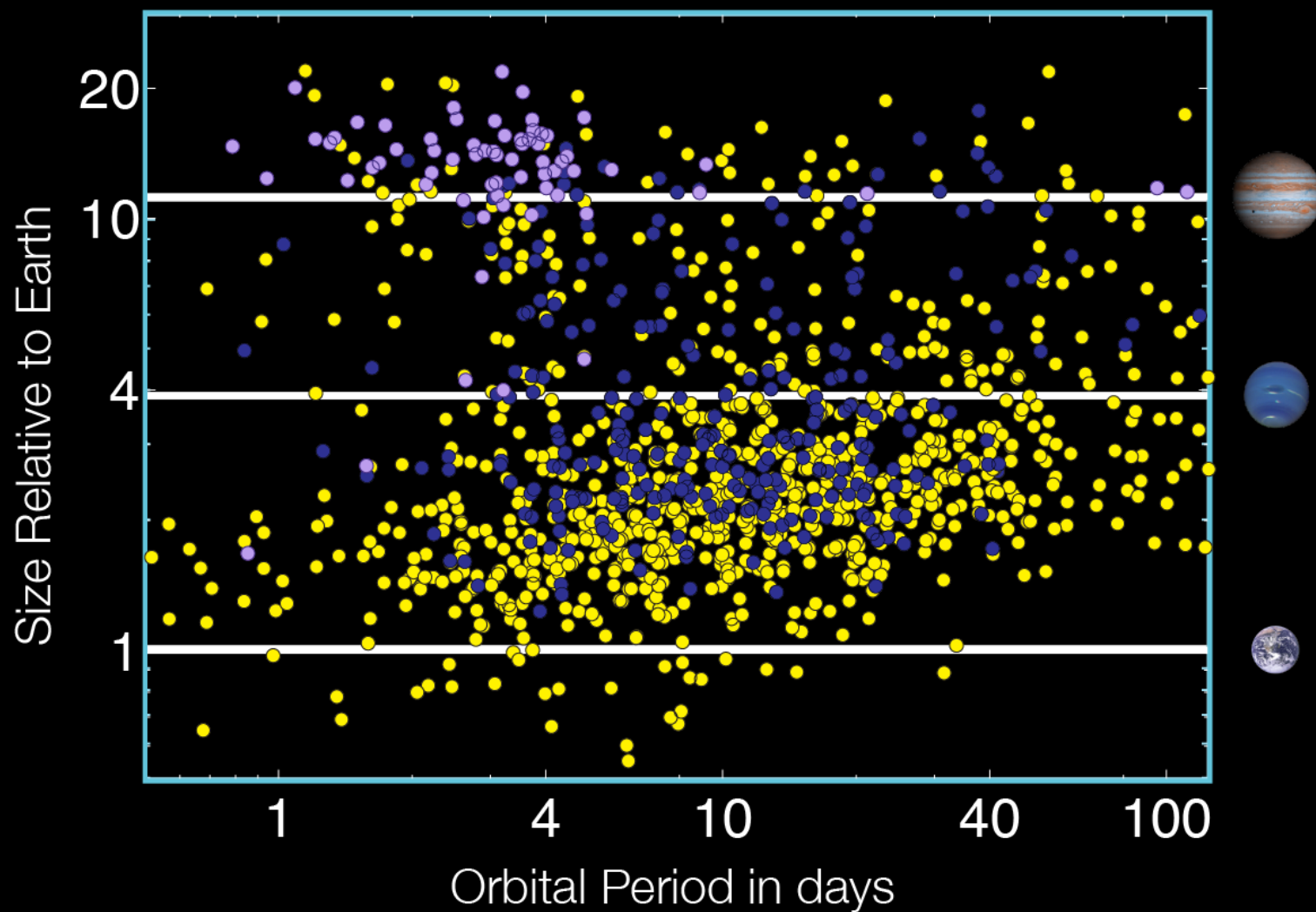
- Determine the frequency of Earth-size and larger planets in the habitable zone of sun-like stars
- Determine the size and orbital period distributions of planets



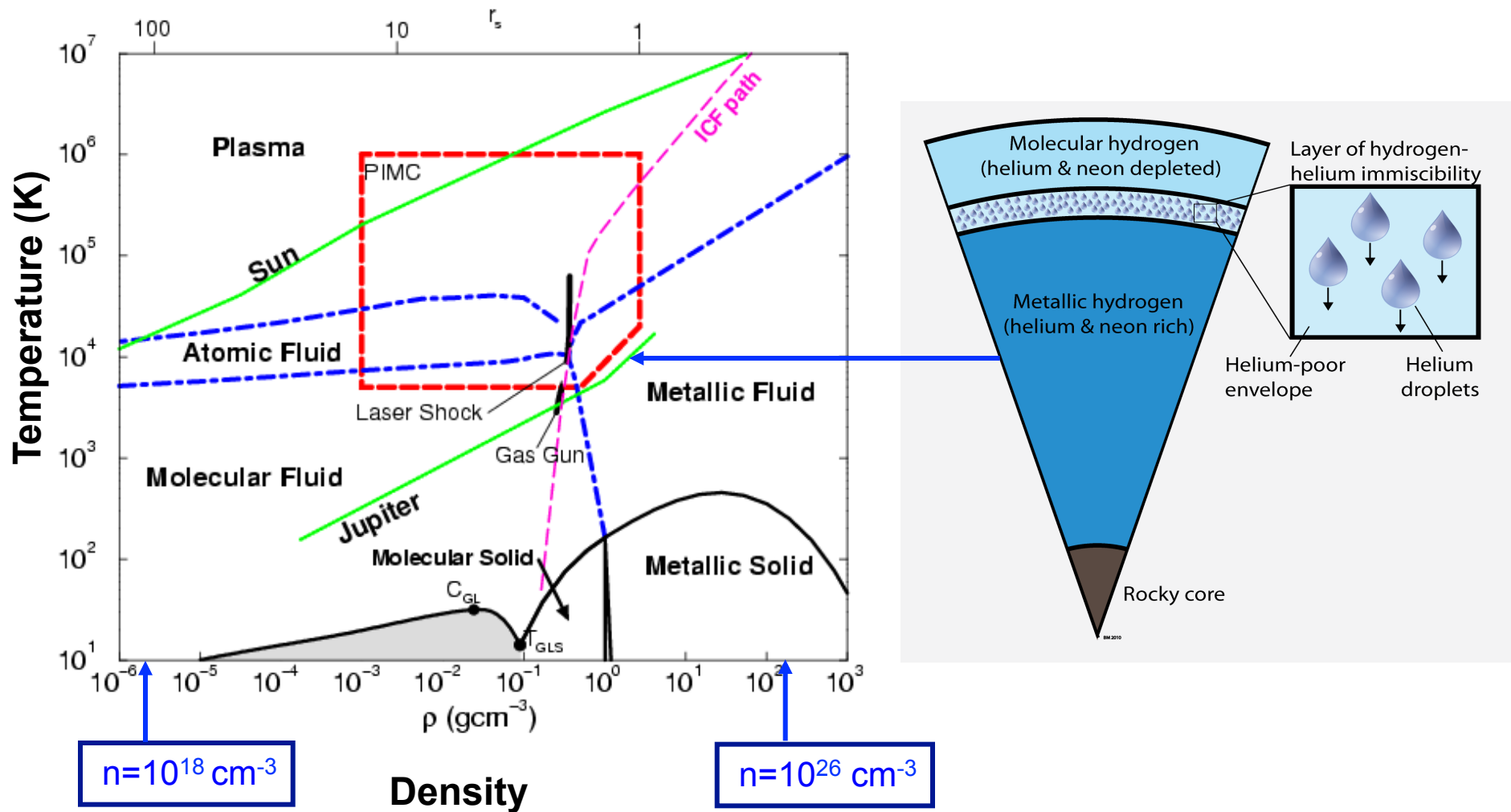
# Pre-Kepler Transiting Planets - 2009



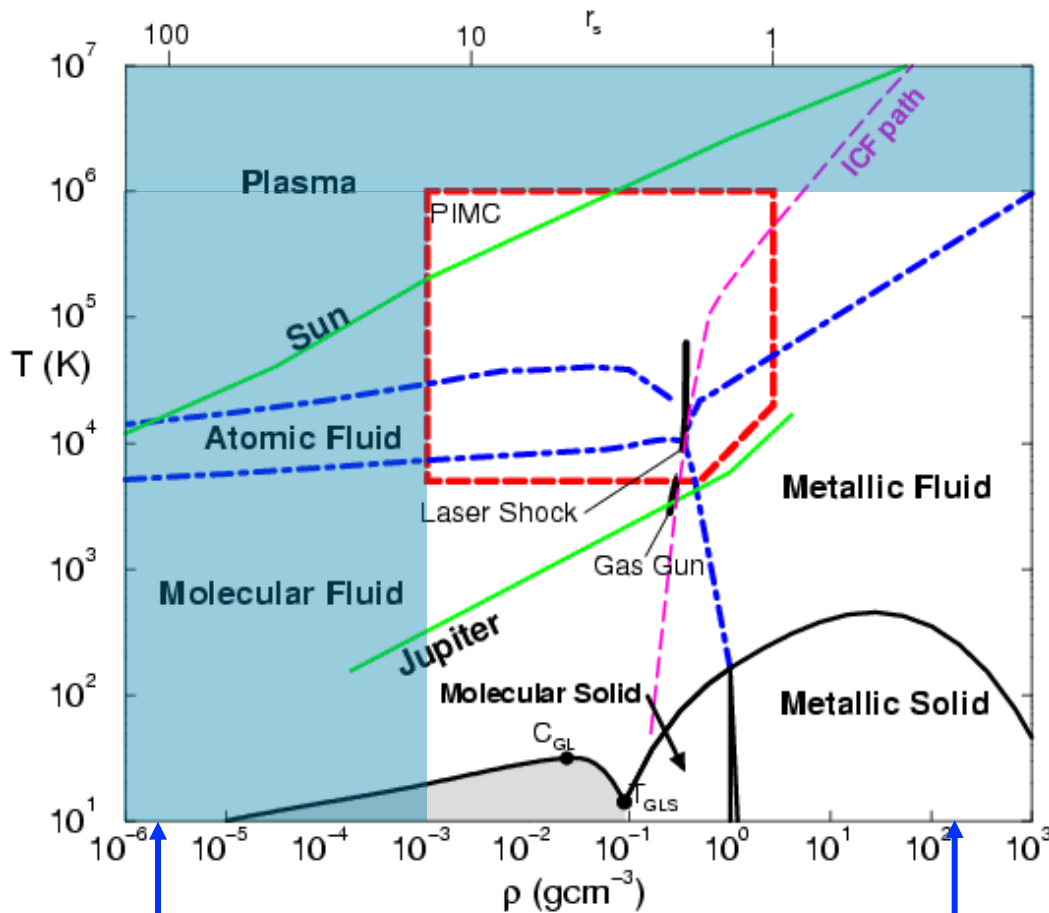
# Kepler Candidates as of February 1, 2011



# Ab initio Simulations to Characterize of the Interiors of Giant Planets



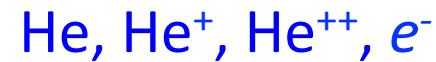
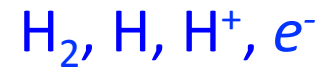
# Use analytical (chemical) models at low density and very high temperature



$n=10^{18} \text{ cm}^{-3}$

$n=10^{26} \text{ cm}^{-3}$

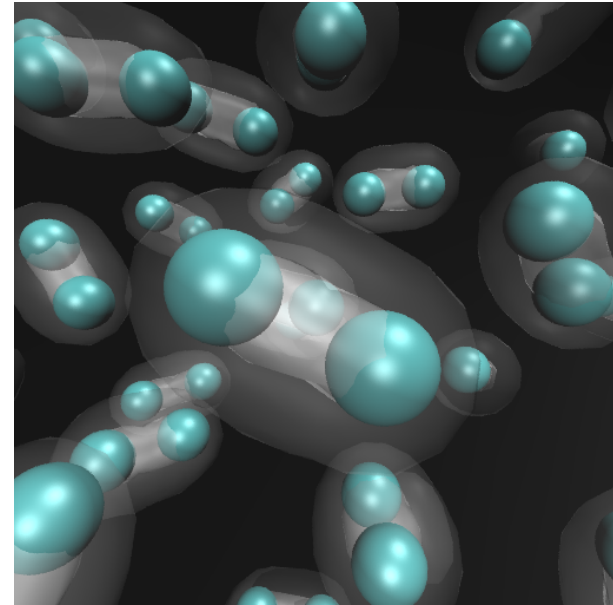
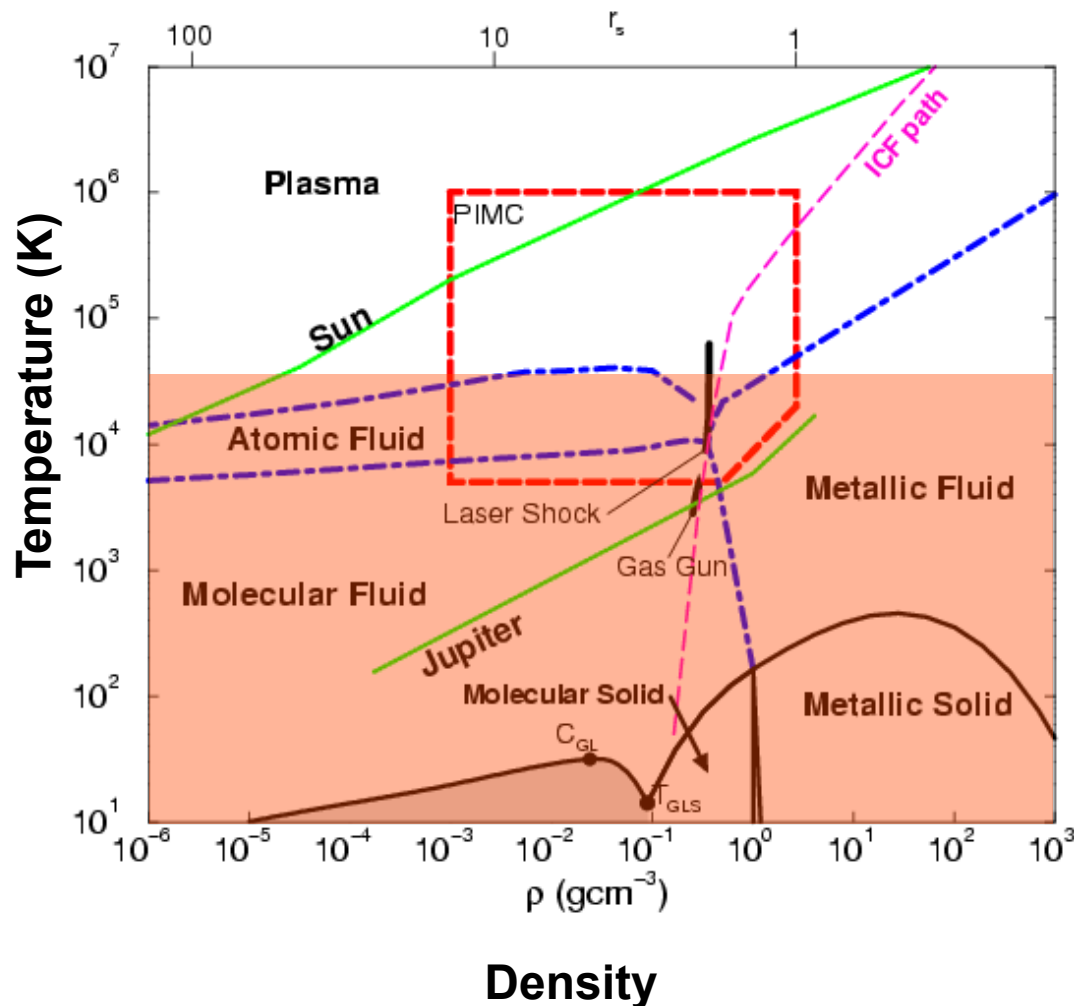
Free energy model to describe weakly interacting chemical species:



Free energy is constructed but it contains free parameters to describe the interaction.

- Saumon and Chabrier model (H+He)
- Sesame data base (many substances)

# Density functional molecular dynamics (DFT-MD) Couple Ion-Electron Monte Carlo (CEIMC) for lower temp.



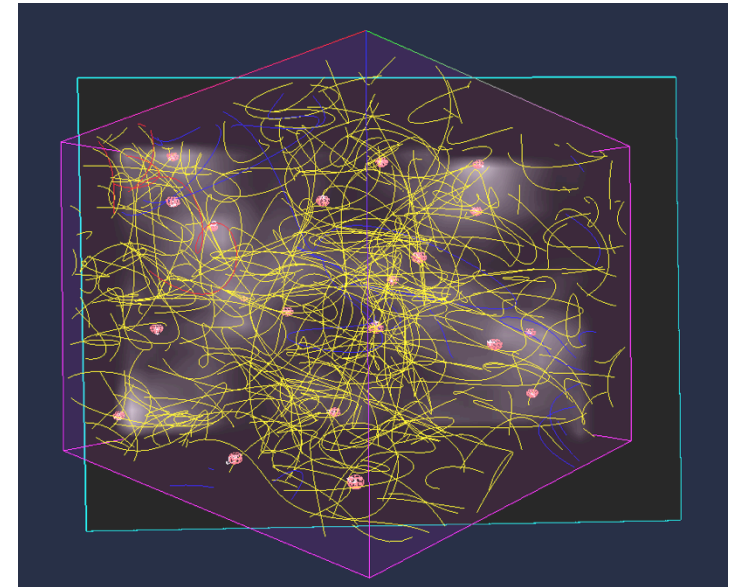
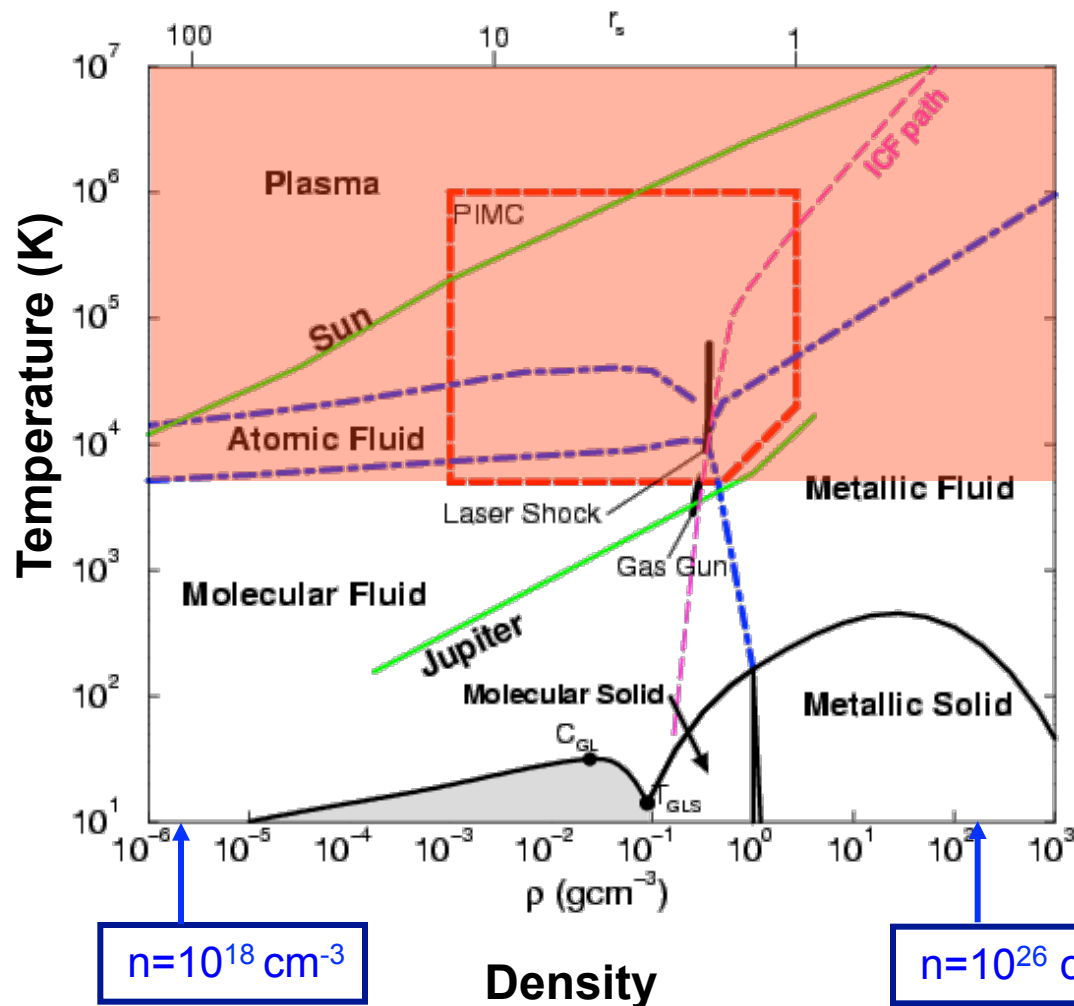
Born-Oppenheimer approx.  
MD with classical nuclei:

$$\mathbf{F} = m \mathbf{a}$$

Forces derived DFT with  
electrons in the instantaneous  
ground state.



# Path integral Monte Carlo for higher temperatures where electronic excitations are present



**PIMC** applicable at:  
 $T > 5000\text{K}$

# ***I. Fermion PIMC with and without nodes***

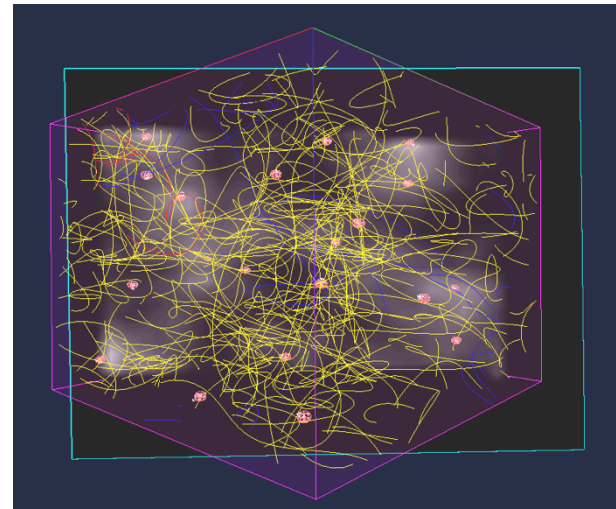
# Fermions lead to Permutations that Carry a **Negative Sign**

Fermionic density matrix:  
Sum over all antisymmetric eigenstates.

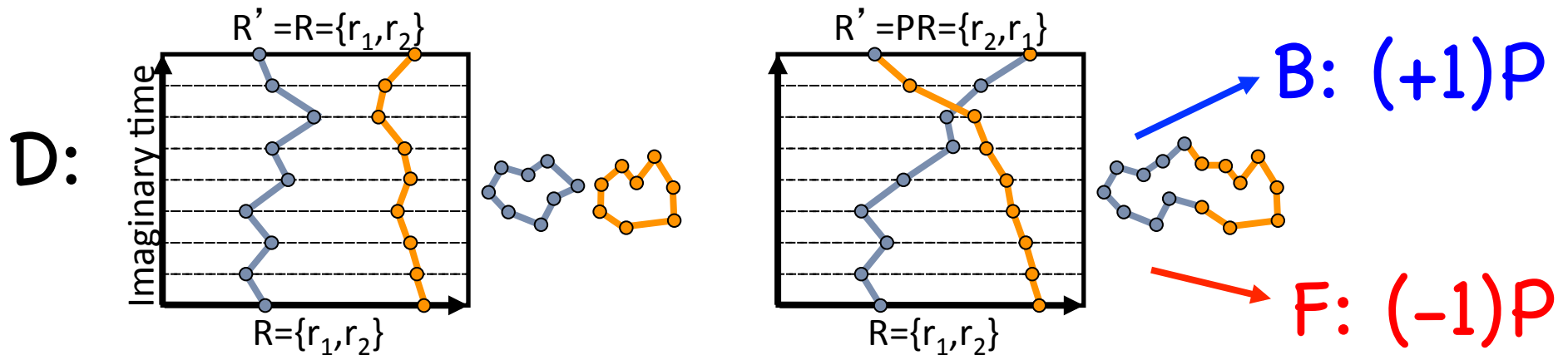
$$\rho_F(R, R', \beta) = \sum_i e^{-\beta E_i} \Psi_{AS}^{[i]*}(R) \Psi_{AS}^{[i]}(R')$$

Project out the antisymmetric states:

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



$$\langle R | \hat{\rho}_{F/B} | R' \rangle = \sum_P (\pm 1)^P \int dR_1 \dots \int dR_{M-1} \langle R | e^{-\tau \hat{H}} | R_1 \rangle \dots \langle R_{M-1} | e^{-\tau \hat{H}} | PR' \rangle$$



# “Direct” Fermion Path Integrals

The **fermion sign problem** poses a major challenge.

$$\langle R | \hat{\rho}_F | R' \rangle = \sum_P (-1)^P \int dR_1 \dots \int dR_{M-1} \langle R | e^{-\tau \hat{H}} | R_1 \rangle \dots \langle R_{M-1} | e^{-\tau \hat{H}} | PR' \rangle$$

How do evaluate an integral with **negative** and **positive** contributions with MC?

→ Let us try the “**direct**” **fermion** method first:

- Sample all path with the bosonic action including permutations, P
- Add a weight factor of **(-1)<sup>P</sup>** when the observables are computed.

$$\langle O \rangle_F = \frac{\langle \sigma(P) O(R) \rangle_B}{\langle \sigma(P) \rangle_B} \quad \sigma(P) = (-1)^P$$

- This is exact, but **positive and negative contributions cancel** to a large extent  
→ **Fermion sign problem**
- The efficiency of the algorithm scale like (Ceperley 1995)

$$\xi = \left[ \frac{M_+ - M_-}{M_+ + M_-} \right]^2 = \left[ \frac{Z_F}{Z_B} \right]^2 = \exp[-2\beta(F_F - F_B)] = \exp[-2\beta N(\mu_F - \mu_B)]$$

# Fixed-Node Method for Fermion PIMC

- Get rid of negative walks by canceling them with some of the positive walks. We can do this if we know where the density matrix changes sign. Restrict walks to those that stay on the same side of the node.
- Fixed-node identity. Gives exact solution if we know the places where the density matrix changes sign: the nodes.

$$\rho_F(R_\beta, R_*; \beta) = \frac{1}{N!} \sum_P (-1)^P \int_{\rho_F(R_t, R_*; t) > 0} dR_t e^{-S(R(t))} \text{ with } R_0 = PR_*$$

- Classical correspondence exists!!
- **Problem:** fermion density matrix appears on both sides of the equation. We need nodes to find the density matrix.

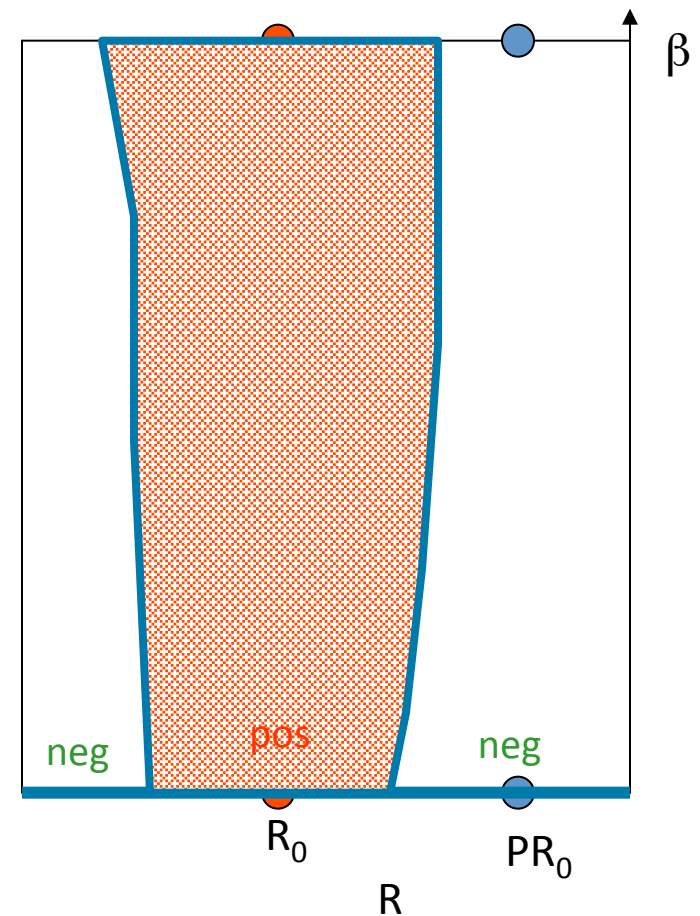
# Proof of the fixed node method for path integrals

1. The density matrix satisfies the Bloch equation with initial conditions.

$$\frac{\partial \rho(R,t)}{\partial t} = \hat{H} \rho(R,t) = \lambda \nabla^2 \rho(R,t) - V(R) \rho(R,t)$$

$$\rho(R,0) = \frac{1}{N!} \sum_P (-1)^P \delta(R - PR_0)$$

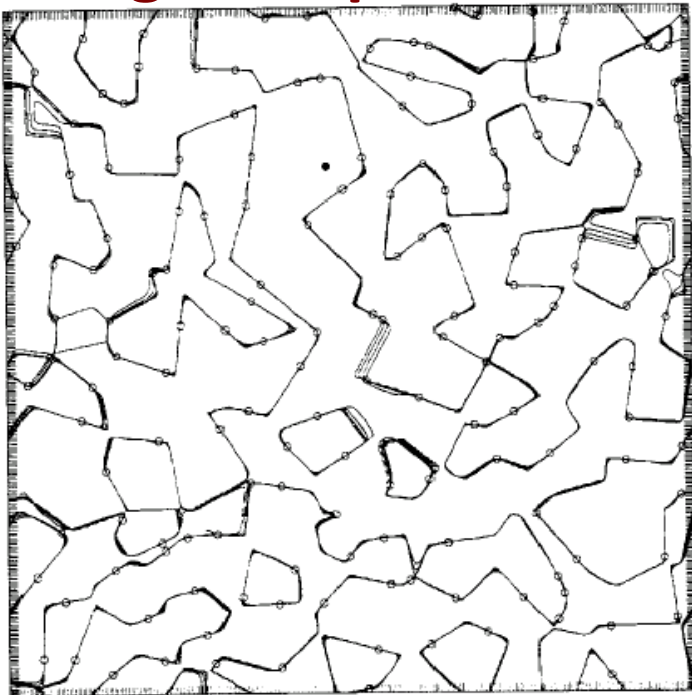
2. One can use more general boundary conditions, not only initial conditions, because solution at the interior is uniquely determined by the exterior-just like the equivalent electrostatic problem.
3. Suppose someone told us the surfaces where the density matrix vanishes (the nodes). Use them as boundary conditions.
4. Putting an infinite repulsive potential at the barrier will enforce the boundary condition.
5. Returning to PI's, any walk trying to cross the nodes will be killed.
6. This means that we just restrict path integrals to stay in one region.



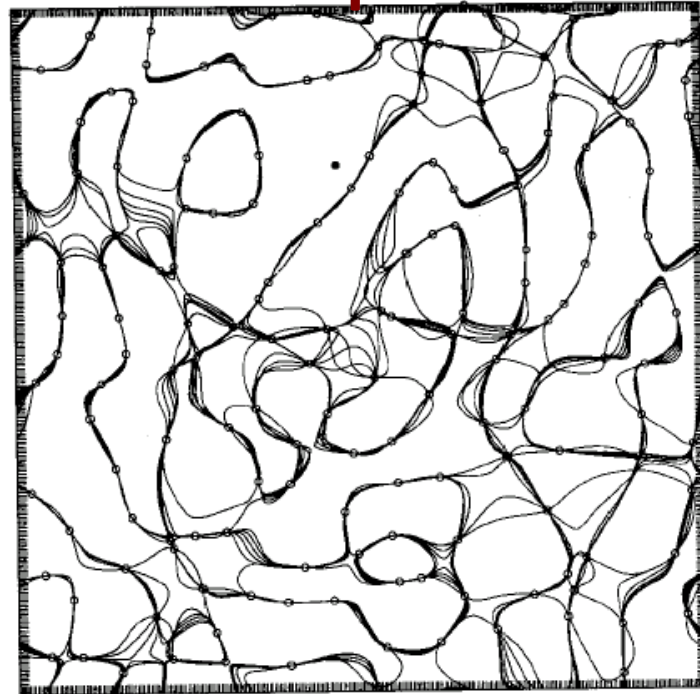
# What nodes shall we used in PIMC?

- To get around the sign problem, why not just use the fixed-node method from  $T=0$  calculation?
- What nodes? The ground state nodes are not necessarily the correct ones at  $T \gg 0$ .
- The nodes of the density matrix have an imaginary time dependence:  $\rho_F(R, R_0; t) = 0$  with  $R_0, t$  fixed.

**High temperature**



**Low temperature**



# Simplest type of nodes: **Free particles nodes** they are **exact at high temperature**

Construct a **fermionic trial density matrix**  
in form of a Slater determinant of  
single-particle density matrices:

$$\rho_T(R, R', \beta) = \begin{vmatrix} \rho_0(r_1, r'_1, \beta) & \cdots & \rho_0(r_1, r'_N, \beta) \\ \vdots & \ddots & \vdots \\ \rho_0(r_N, r'_1, \beta) & \cdots & \rho_0(r_N, r'_N, \beta) \end{vmatrix}$$

Free particle density matrix:

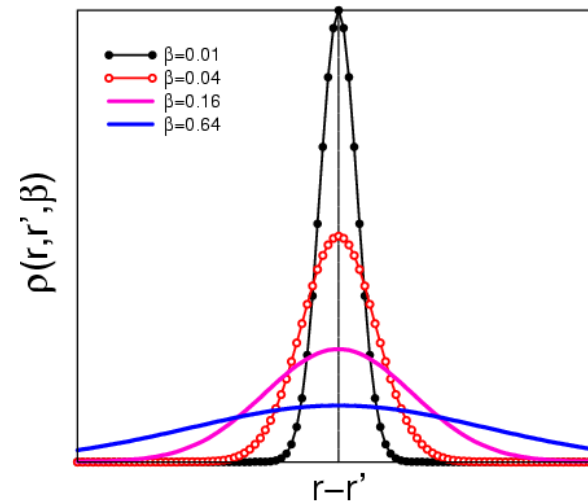
$$\rho_0(r, r', \beta) = \frac{1}{V} \int d^3k e^{-\beta\lambda k^2} e^{-ikr} e^{+ikr'}$$

$$\rho_0(r, r', \beta) = (4\pi\lambda\beta)^{-D/2} \exp\left[-\frac{(r-r')^2}{4\lambda\beta}\right]$$

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 [Ceperley et al. 1995]  
⇒ “Solves” the fermion sign problem.



$$\lambda = \frac{\hbar^2}{2m}$$

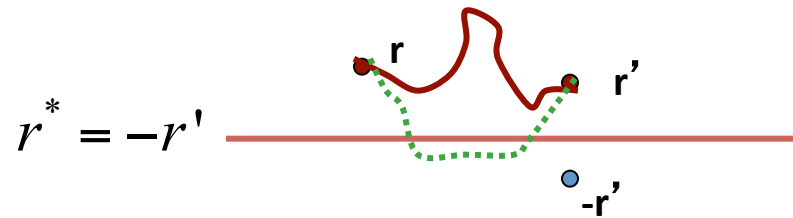
$$\beta = \frac{1}{k_b T}$$



# Nodal action

- Principal rule: simply reject paths if they cross a node.
- Will lead to an error proportional to  $\sqrt{\lambda\tau} / r_{nn}$
- Improved nodal action: solve for a particle next to a planar node. Use method familiar from electrostatics, the method of images:

$$\rho(r', r; t) = e^{-\frac{(r-r')^2}{4\lambda\tau}} - e^{-\frac{(r-r^*)^2}{4\lambda\tau}}$$



$$\delta S(r', r; t) = -\ln\left(1 - e^{-\frac{dd'}{\lambda\tau}}\right)$$

$$d = \text{distance to node} \approx \left| \nabla \ln(\rho(R, R'; \tau)) \right|^{-1}$$

- Determine nodal distance using “Newton estimate.”
- As paths approach within a thermal wavelength of the node, we get a repulsion, to account for the probability that a path could have crossed and recrossed within  $\tau$ .

***II. Better nodes:  
Variational Density  
Matrix***

# Derivation of a Variational Density Matrix

(see Militzer, Pollock, Phys. Rev. E 61 (2000) 3470)

Bloch equation: 
$$-\frac{\partial \rho}{\partial \beta} = \mathcal{H}\rho$$

Ansatz for density matrix

$$\rho(\mathcal{R}, \mathcal{R}'; \beta) = \rho(\mathcal{R}, q_1, \dots, q_m) \quad q_k = q_k(\mathcal{R}', \beta)$$

Variational principle:  $\delta I = 0$

$$I \left( \frac{\partial \rho}{\partial \beta} \right) = \int d\beta \int d\mathcal{R} \left( \frac{\partial \rho}{\partial \beta} + \mathcal{H}\rho \right)^2$$

⇒ ordinary differential equations for  $q_k$  in imaginary time

Slater determinant:  $\rho(\mathcal{R}, \mathcal{R}'; \beta) = \|\rho^{[1]}(\mathbf{r}_i, \mathbf{r}'_j; \beta)\|_{ij}$

Gaussian Ansatz:

$$\rho^{[1]}(\mathbf{r}, \mathbf{r}', \beta) = (\pi w)^{-3/2} \exp \left\{ -\frac{1}{w} (\mathbf{r} - \mathbf{m})^2 + d \right\}$$

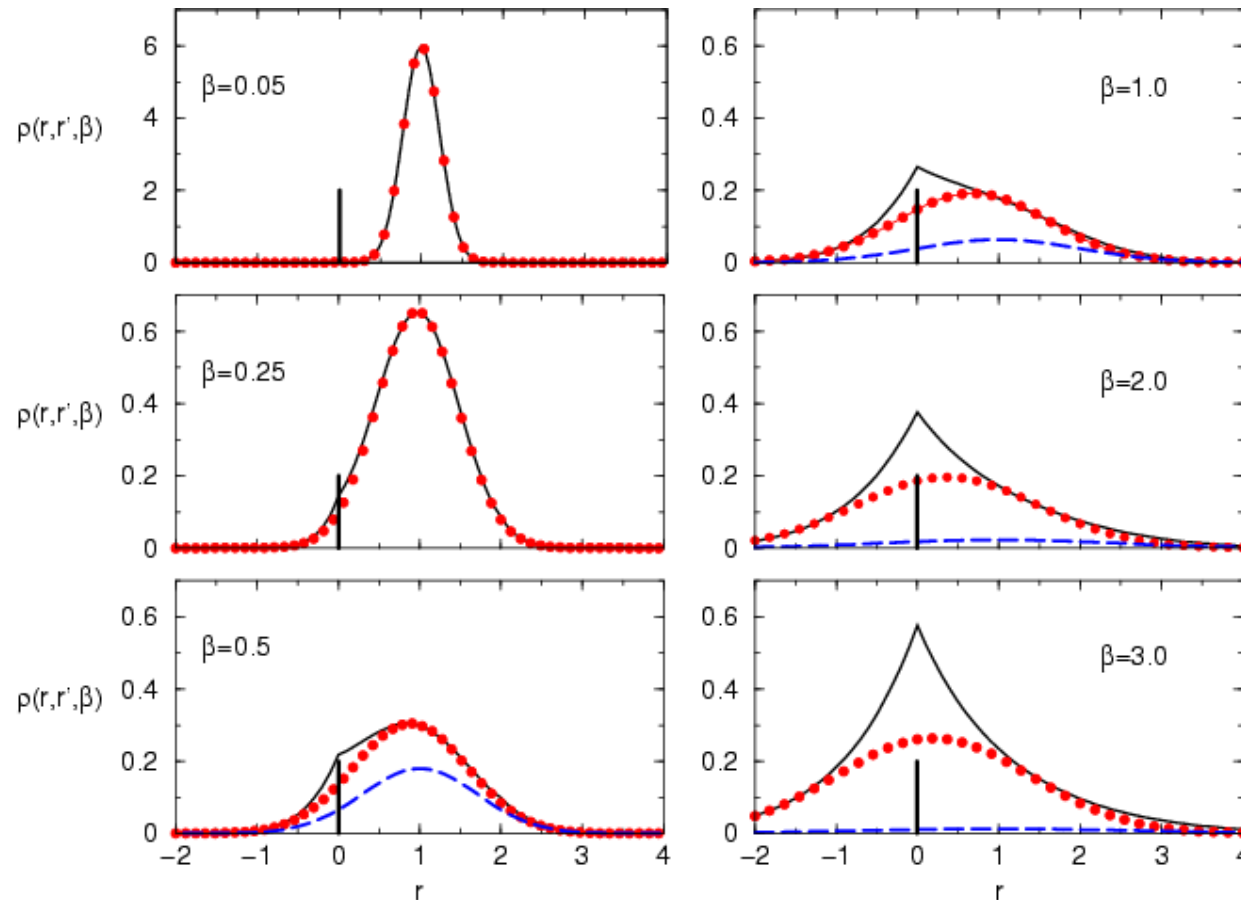
Variational parameters:  $\mathbf{m}$  ... mean position ( $= r'$ )  
 $w$  ... squared width ( $= 4\lambda\beta$ )  
 $d$  ... amplitude ( $= 0$ )

# Derivation of a Variational Density Matrix

(see Miltzer, Pollock, Phys. Rev. E 61 (2000) 3470)

Gaussian Ansatz:

$$\rho^{[1]}(\mathbf{r}, \mathbf{r}', \beta) = (\pi w)^{-3/2} \exp \left\{ -\frac{1}{w} (\mathbf{r} - \mathbf{m})^2 + d \right\}$$



# Comparison: T=0 and T>0 Fermion Methods

## Analogy to Ground State Methods

T = 0

$$\Psi_{GS}(\mathbf{R})$$

$$E \leq \langle \Psi | H | \Psi \rangle / \langle \Psi | \Psi \rangle$$

T > 0

$$\rho(\mathbf{R}, \mathbf{R}'; \beta) = \sum_s e^{-\beta E_s} \Psi_s(\mathbf{R}) \Psi_s(\mathbf{R}')$$

$$F \leq \text{Tr}[\tilde{\rho} H] + kT \text{Tr}[\tilde{\rho} \ln \tilde{\rho}] \quad \tilde{\rho} = \rho / \text{Tr}[\rho]$$

1.

## Effective Single Particle Level

$$\Psi_{KS}(\mathbf{R}) = \begin{vmatrix} \Phi_1(r_1) & \dots & \Phi_N(r_1) \\ \dots & \dots & \dots \\ \Phi_1(r_N) & \dots & \Phi_N(r_N) \end{vmatrix}$$

$$\rho(\mathbf{R}, \mathbf{R}'; \beta) = \begin{vmatrix} \rho^{[1]}(r_1, r'_1; \beta) & \dots & \rho^{[1]}(r_N, r'_1; \beta) \\ \dots & \dots & \dots \\ \rho^{[1]}(r_1, r'_N; \beta) & \dots & \rho^{[1]}(r_N, r'_N; \beta) \end{vmatrix}$$

$$\text{LDA: } \epsilon_s \Phi_s = -\frac{\nabla^2}{2} \Phi_s + V_{eff} \Phi_s$$

Variational solution of many-body Bloch Equation

2.

## Correlations beyond LDA or Mean Field

Jastrow

$$\Psi_{GS}(\mathbf{R}) = \Psi_{KS}(\mathbf{R}) \prod_{i,j} f(r_{ij})$$

Finite Temperature Jastrow

$$\rho(\mathbf{R}, \mathbf{R}'; \beta) = \rho_{MF}(\mathbf{R}, \mathbf{R}'; \beta) \prod_{i,j} f(r_{ij}, r'_{ij}; \beta)$$

3.

Diffusion QMC

Restricted PIMC

***III. Example: Paths  
of two free particle***

# Fermionic Path Integrals

## Example: 2 free particles

Distinguishable particles:

Consider path types:  $A + B$

Bosons:

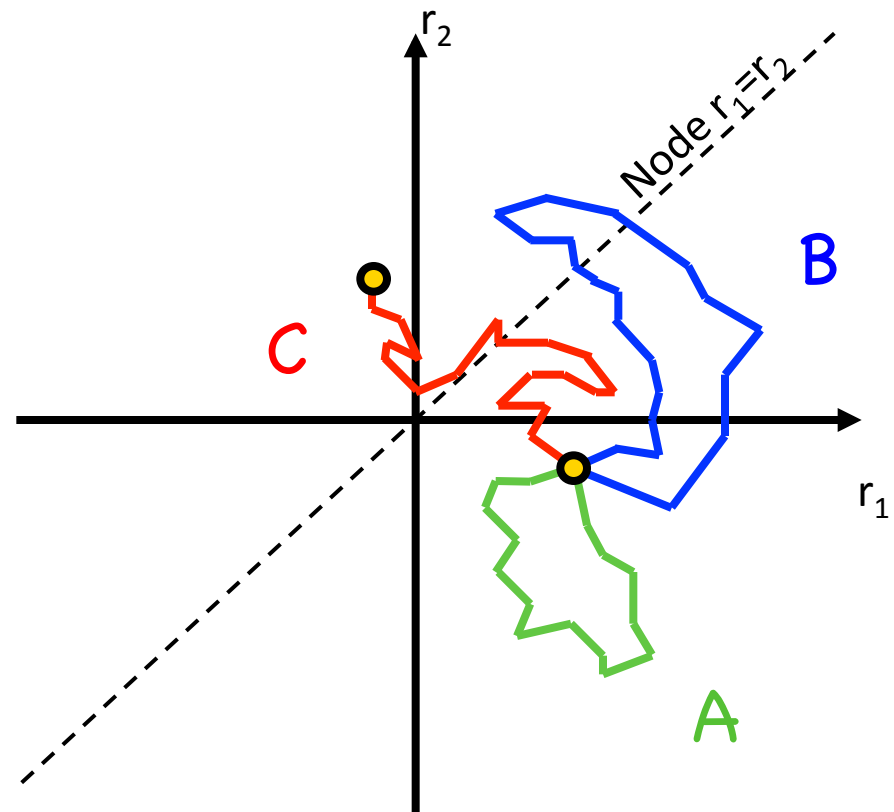
Consider path types:  $A + B + C$

Direct fermions:

Consider path types:  $A + B - C$

Restricted fermions:

Consider only path type:  $A$

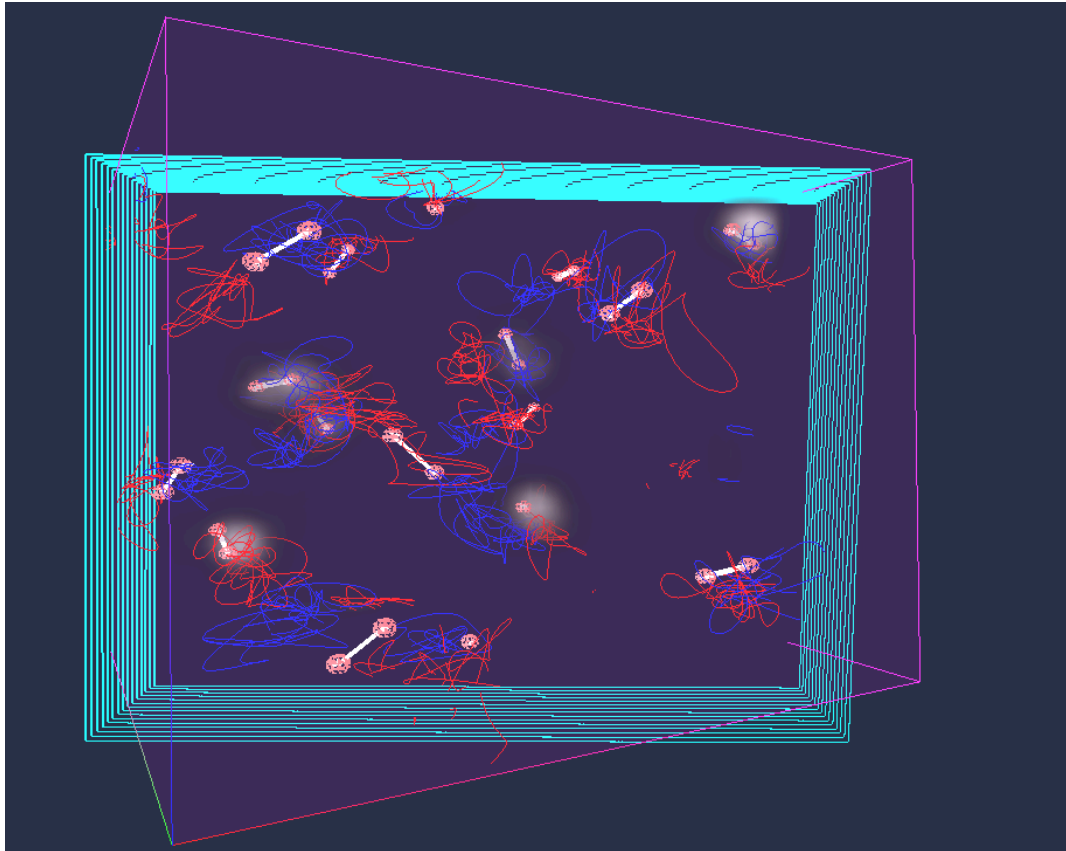


***IV. Application to  
hot, dense hydrogen  
and Shock Wave  
Experiments***

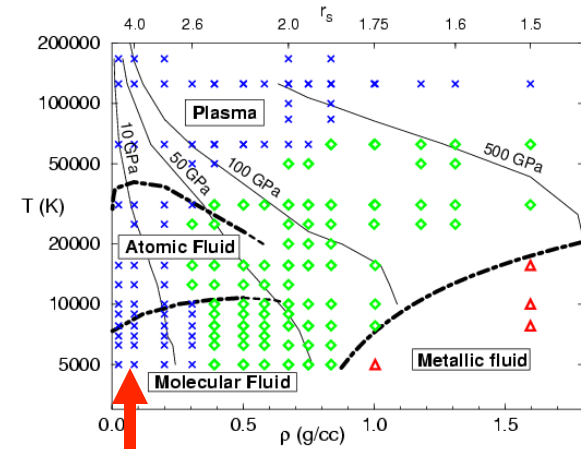


# Molecular Hydrogen

Snapshot from a PIMC simulation with 32 protons and electrons



2 protons (pink spheres) and spin-up and one spin-down electron form one  $H_2$  molecule.

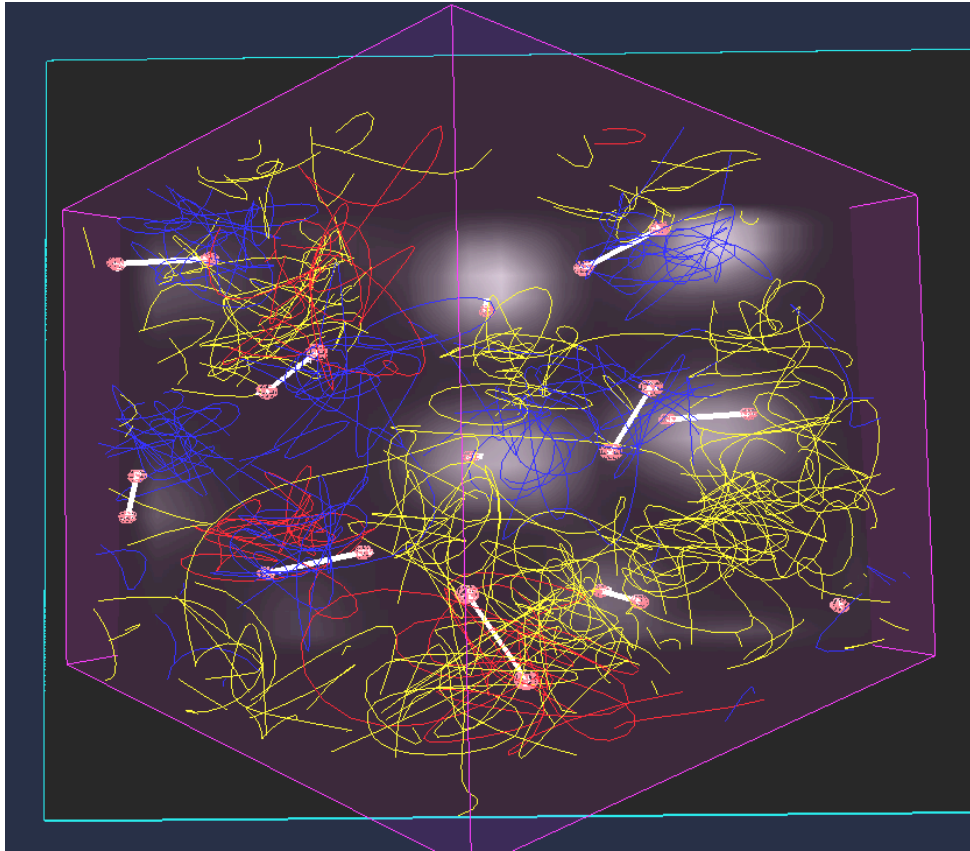


$T=5000\text{K}, r_s=4$

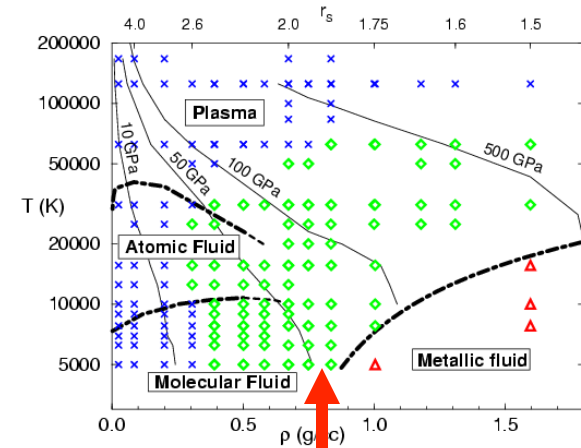
100% molecules,  
weakly interacting

# Molecular Hydrogen

Snapshot from a PIMC simulation with 32 protons and electrons



2 protons (pink spheres) and spin-up and one spin-down electron form one  $H_2$  molecule.

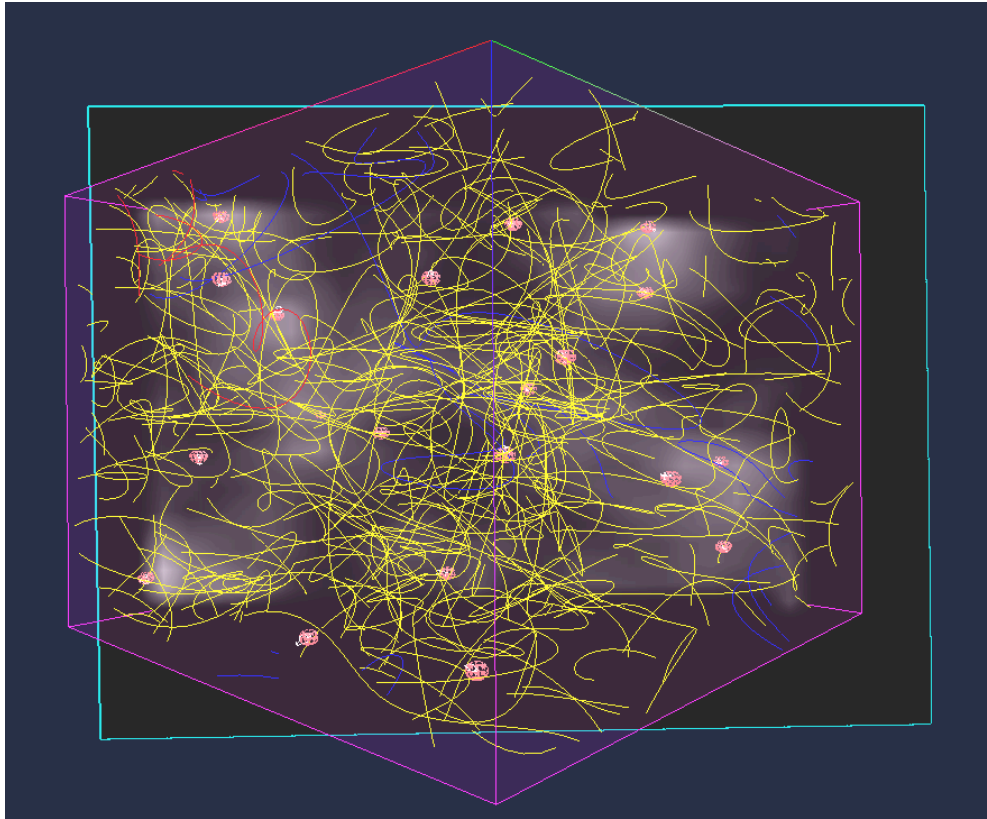


$T=5000\text{K}$ ,  $r_s=1.86$

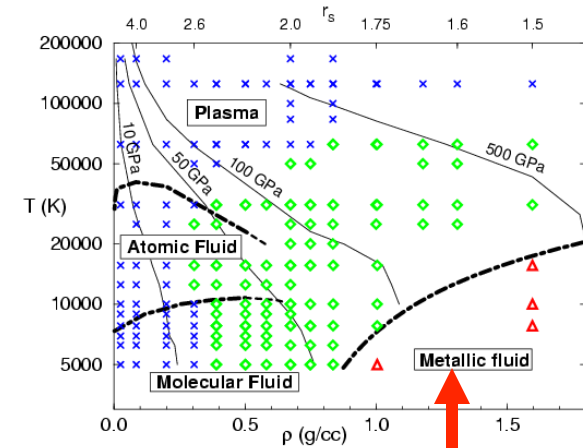
- strongly interacting molecules, close to pressure dissociation
- Electrons are degenerate, partially delocalized
- Electron paths are permuting

# Metallic Hydrogen

Snapshot from a PIMC simulation with 32 protons and electrons



Free protons (pink spheres) and delocalized electrons.



$T=5000\text{K}, r_s=1.6$

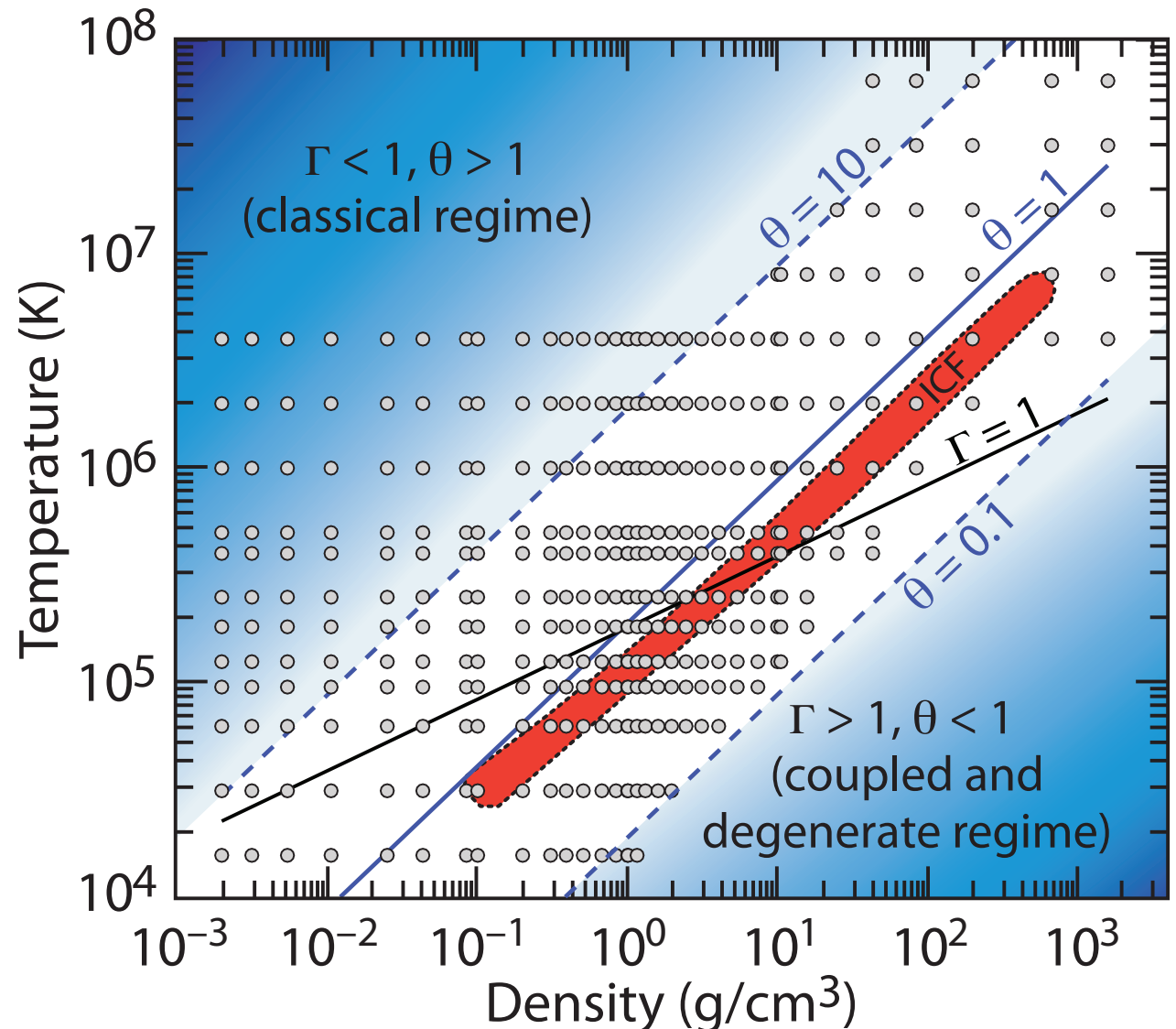
- Pressure dissociation, free protons
- Degenerate electron gas
- High number of permutations

# Recent **PIMC** work provides EOS for ICF conditions (**FPEOS** table constructed)

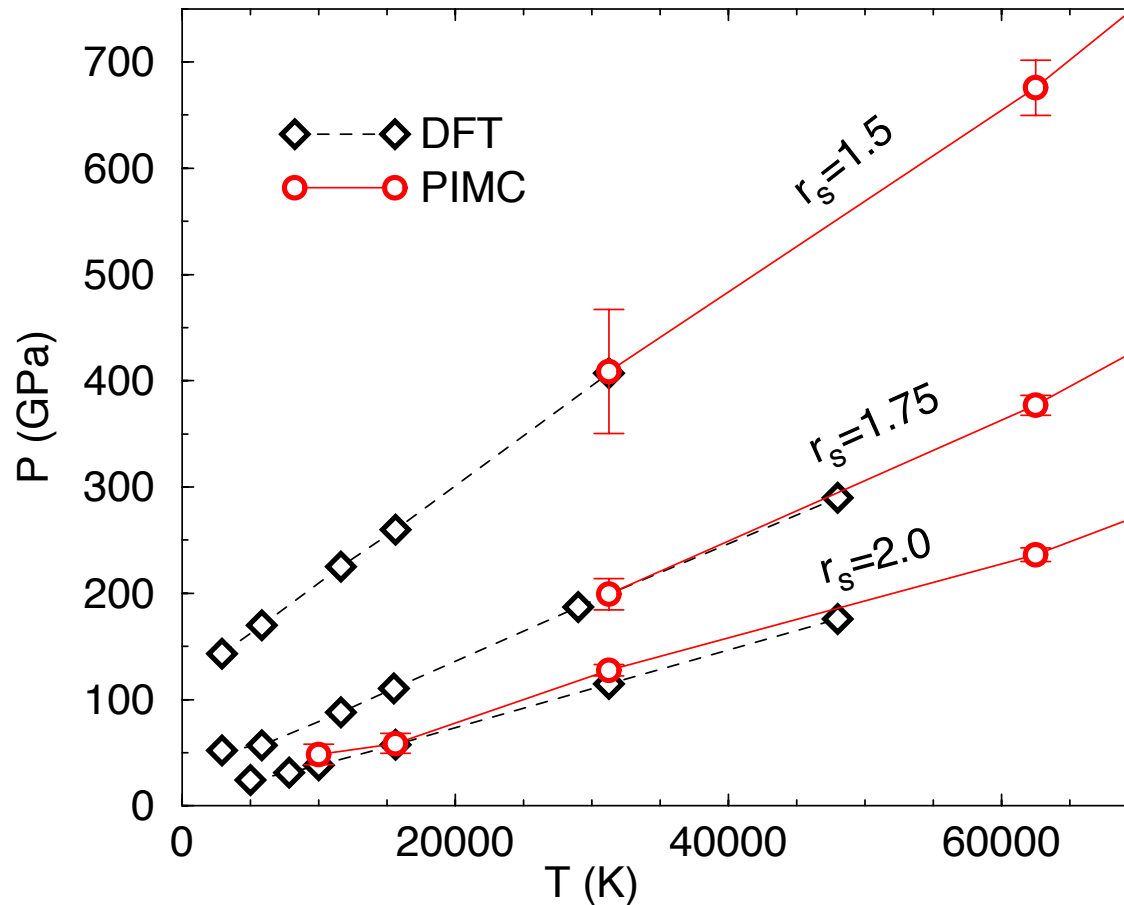
Hydrogen

S. X. Hu, B. Militzer, V. N. Goncharov, S. Skupsky,  
*Phys. Rev. Lett.*, **104**  
(2010) 235003

*Phys. Rev. B* **84**  
(2011) 224109.



# For hydrogen, **PIMC** and **DFT-MD** Simulations Predict Consistent Shock Properties

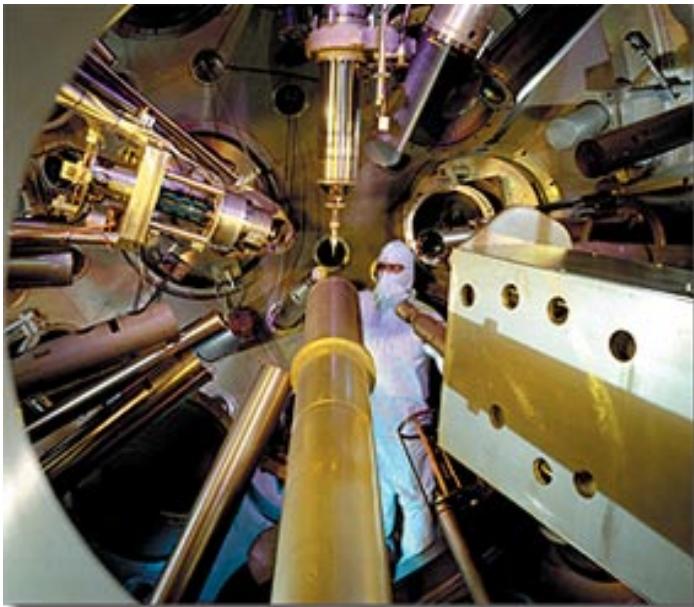


B. Militzer, D. M. Ceperley, J. D. Kress, J. D. Johnson, L. A. Collins, S. Mazevet,  
*Phys. Rev. Lett.* **87** (2001) 275502

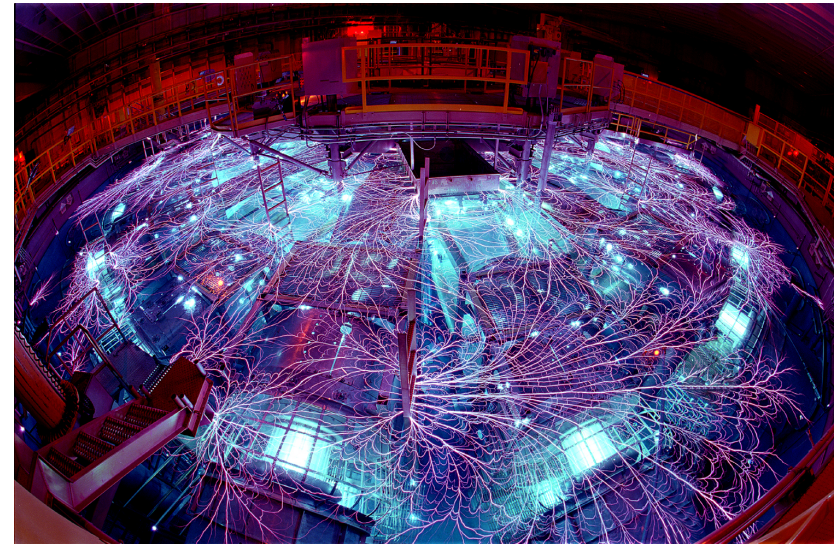
# Study planetary interiors in the laboratory: shock wave experiments



1) Two-stage gas gun (Livermore)  
20 GPa in deuterium



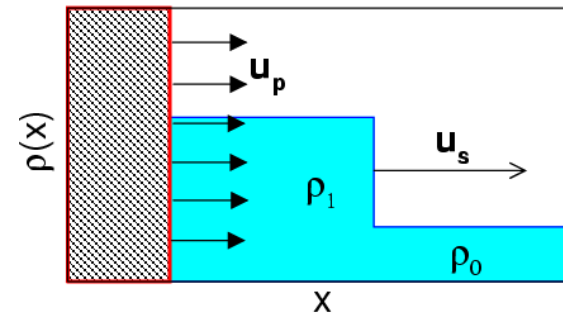
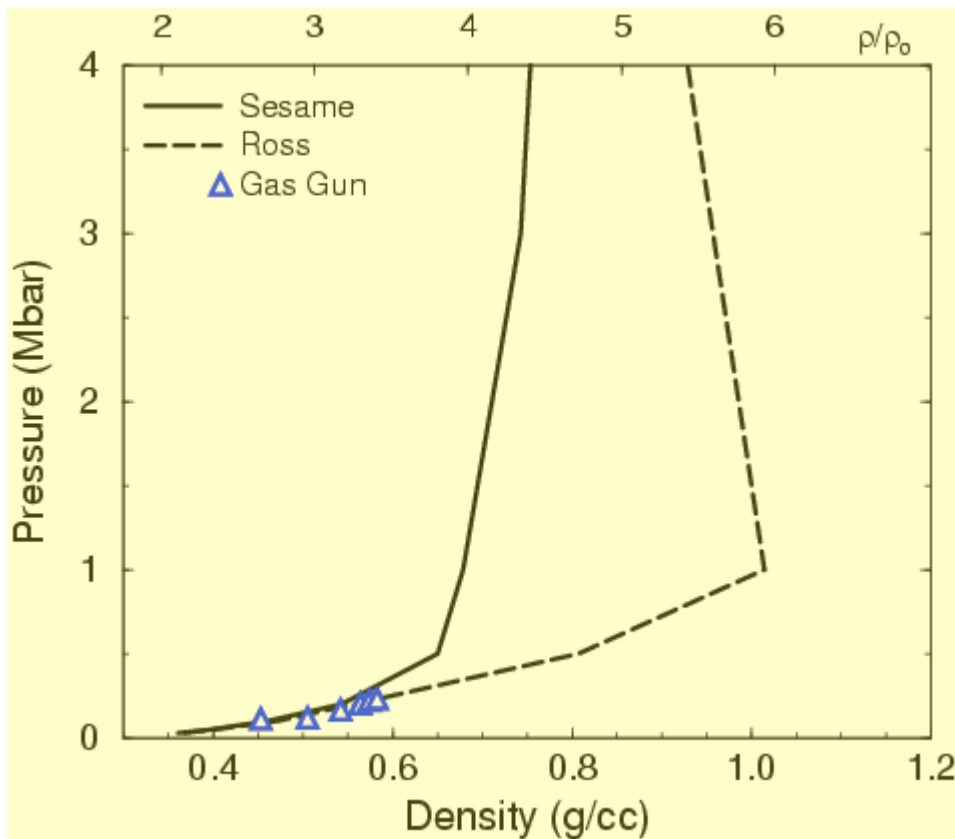
2) Nova laser (Livermore) 340 GPa



3) Z capacitor bank (Sandia) 175 GPa

4) NIF...

# Shock wave measurements determine the EOS on the Hugoniot curve



Conservation of mass, momentum and energy yields:

$$\frac{\rho}{\rho_0} = \frac{u_s}{u_s - u_p}$$

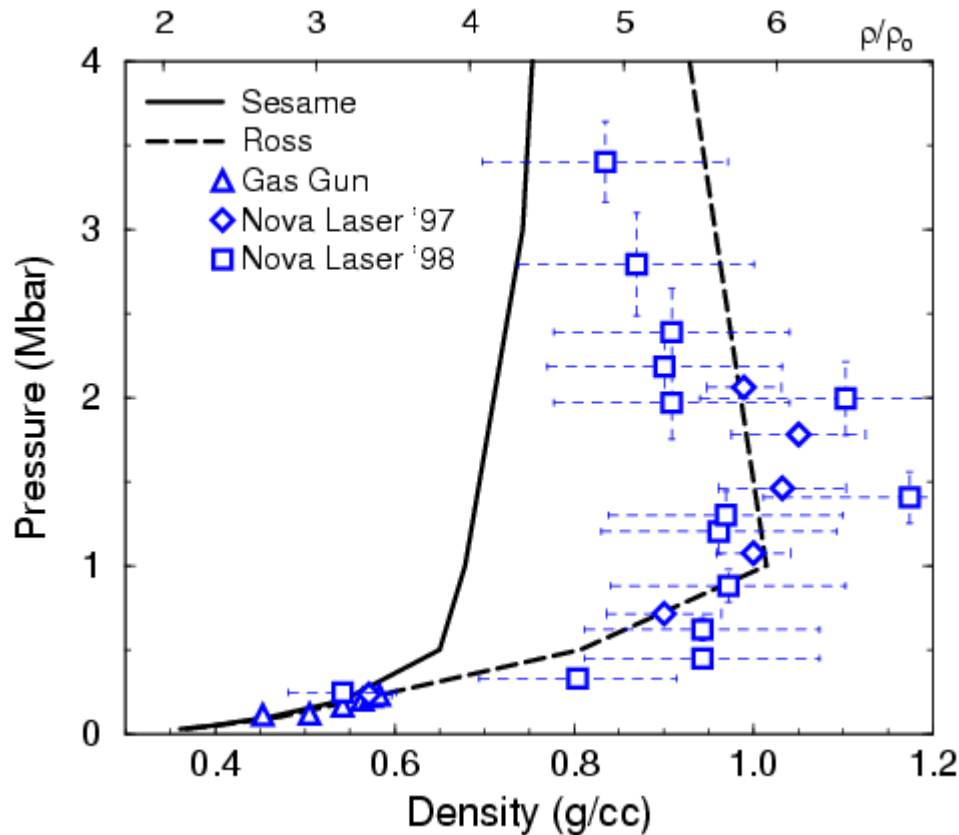
$$p - p_0 = \rho_0 u_s u_p$$

$$E - E_0 = \frac{1}{2} (V_0 - V) (P + P_0)$$

Gas gun (LLNL), Sesame model (Kerley), linear mixing model (M.Ross)

# Deuterium Hugoniot

Nova laser shock wave experiments reached 3.4 Mbar



Why is the compressibility so high?

What does this imply for the dissociation of molecules?

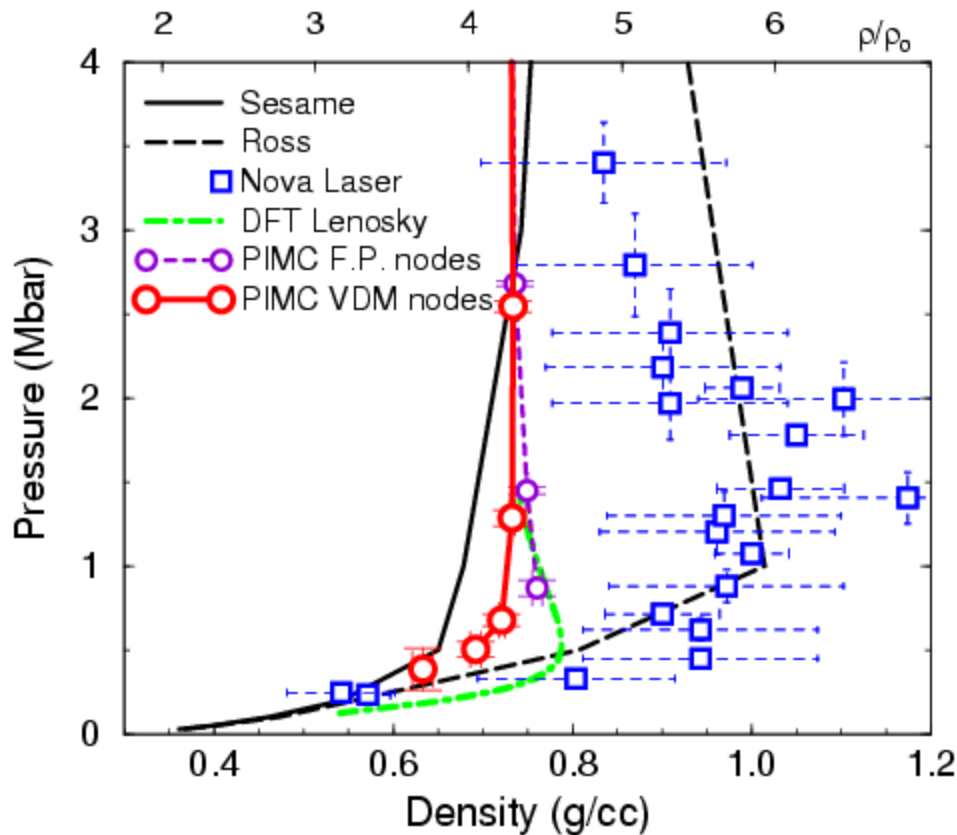
Are electronic excitations important?

Nova laser results predict a 50% higher compressibility.



# Deuterium Hugoniot

## Path integral Monte Carlo results



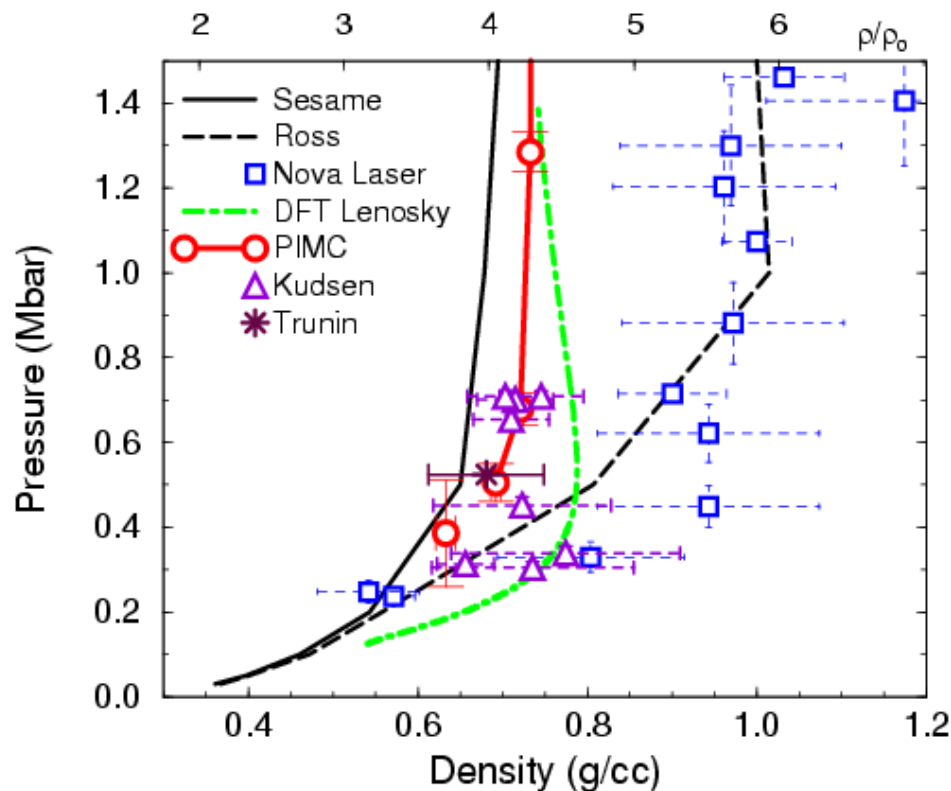
Militzer and Ceperley,  
*Phys. Rev. Lett.* 85 (2000) 1890.  
*Phys. Rev. Lett.* 87 (2001) 275502

- Accuracy increases with T
- Small size dependence
- Comparison of VDM and free particle nodes

Discrepancy:  
 $\Delta E/N = 3 \text{ eV}$   
 $\Delta PV/N = -2 \text{ eV}$

Good agreement between all *ab initio* methods.

# PIMC predicts low compressibility and agrees with more recent experiments



Militzer, Ceperley *et al.*

*Phys. Rev. Lett.* **85** (2000) 1890.

*Phys. Rev. Lett.* **87** (2001) 275502.

- Predict low compressibility!

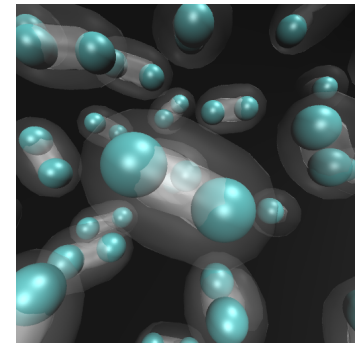
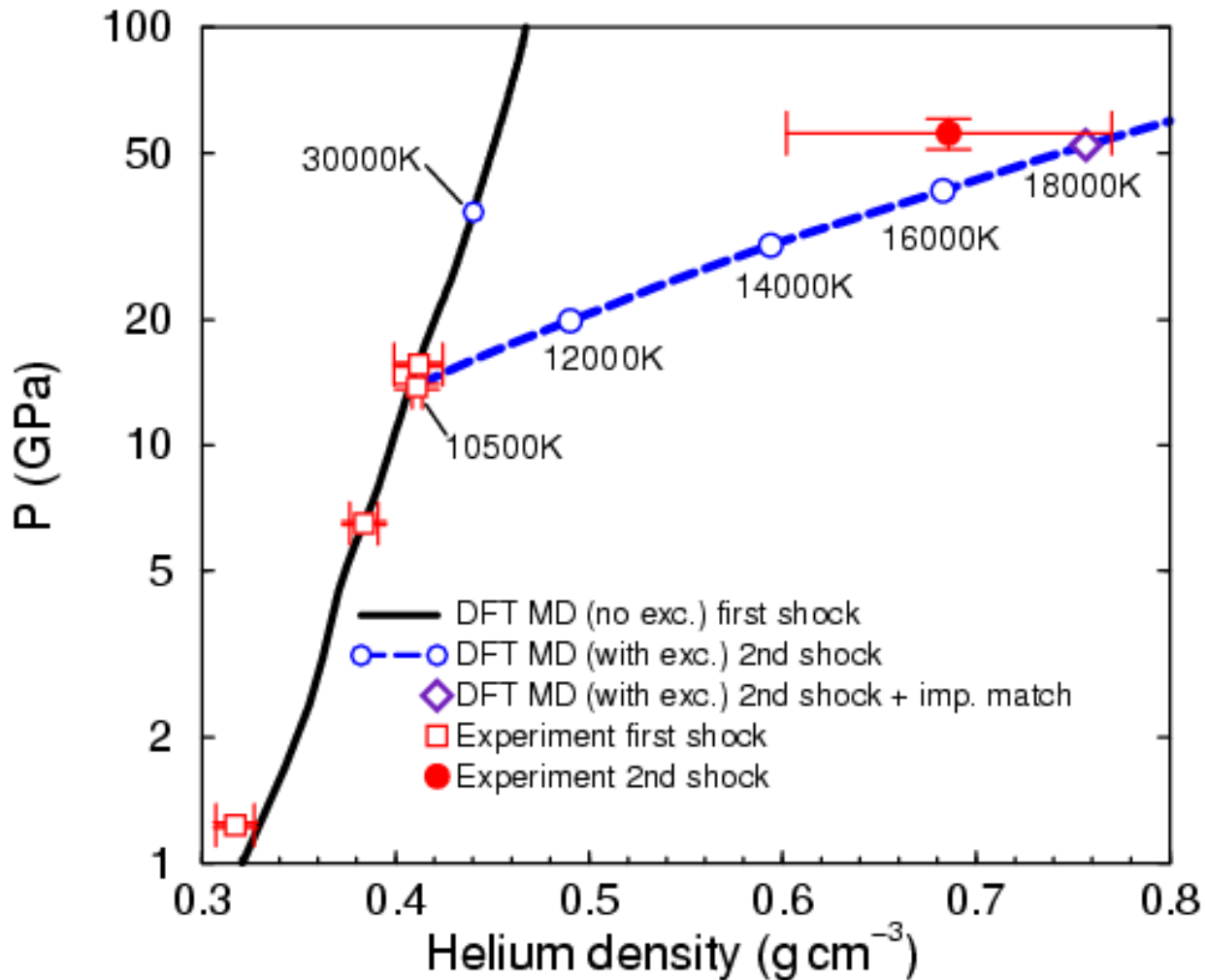
Good agreement with:

- Magnetic shocks waves  
[Knudson *et al.*, PRL **87** (2001) 225501]
- Spherical converging shock waves  
[Belov *et al*, Boriskov *et al.*]
- DFT results (e.g. Bonev *et al.*)

Recent measurements agree reasonably well with first principle methods but need to be verified.

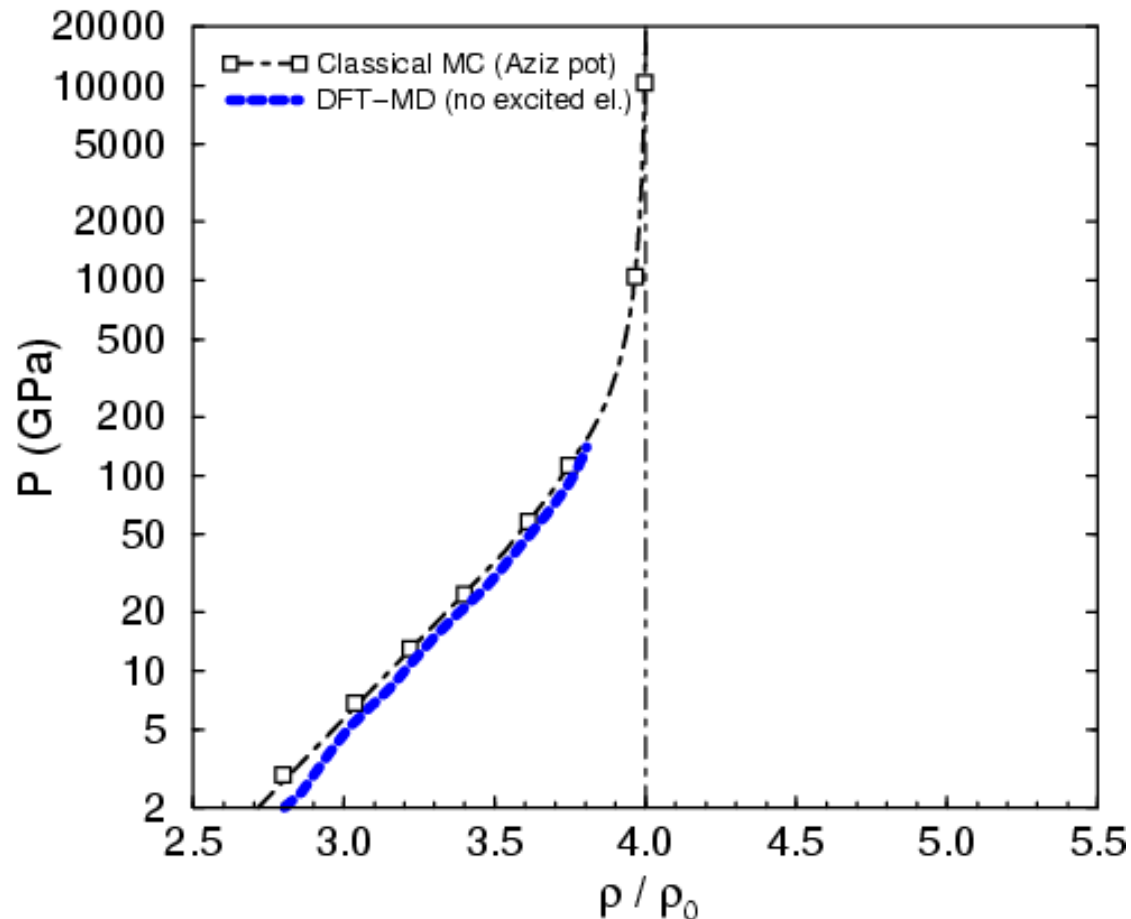
**V.** *Application to  
hot, dense helium*

# Helium DFT calculations agree well with gas gun shock experiment [Nellis PRL (1984)]



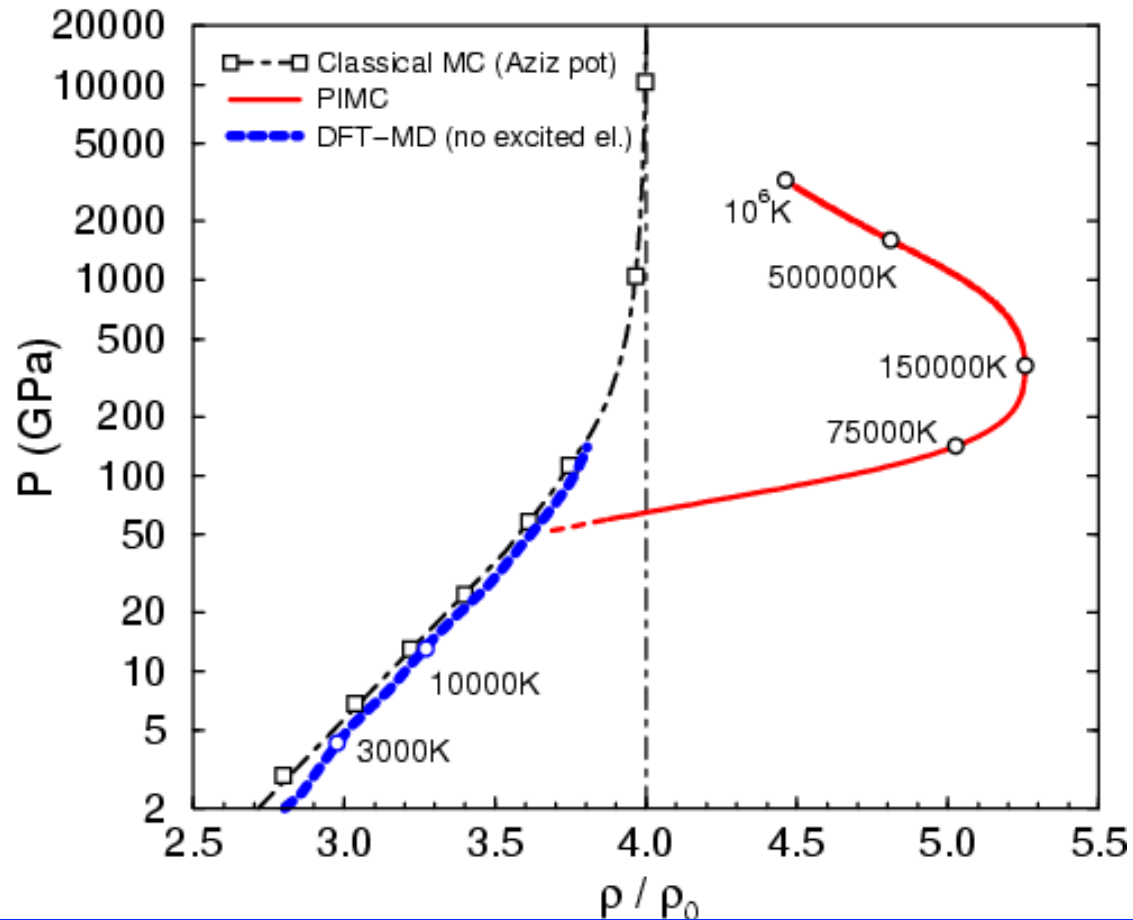
DFT-MD

# DFT-MD and classical MC simulation yield less than 4-fold compression



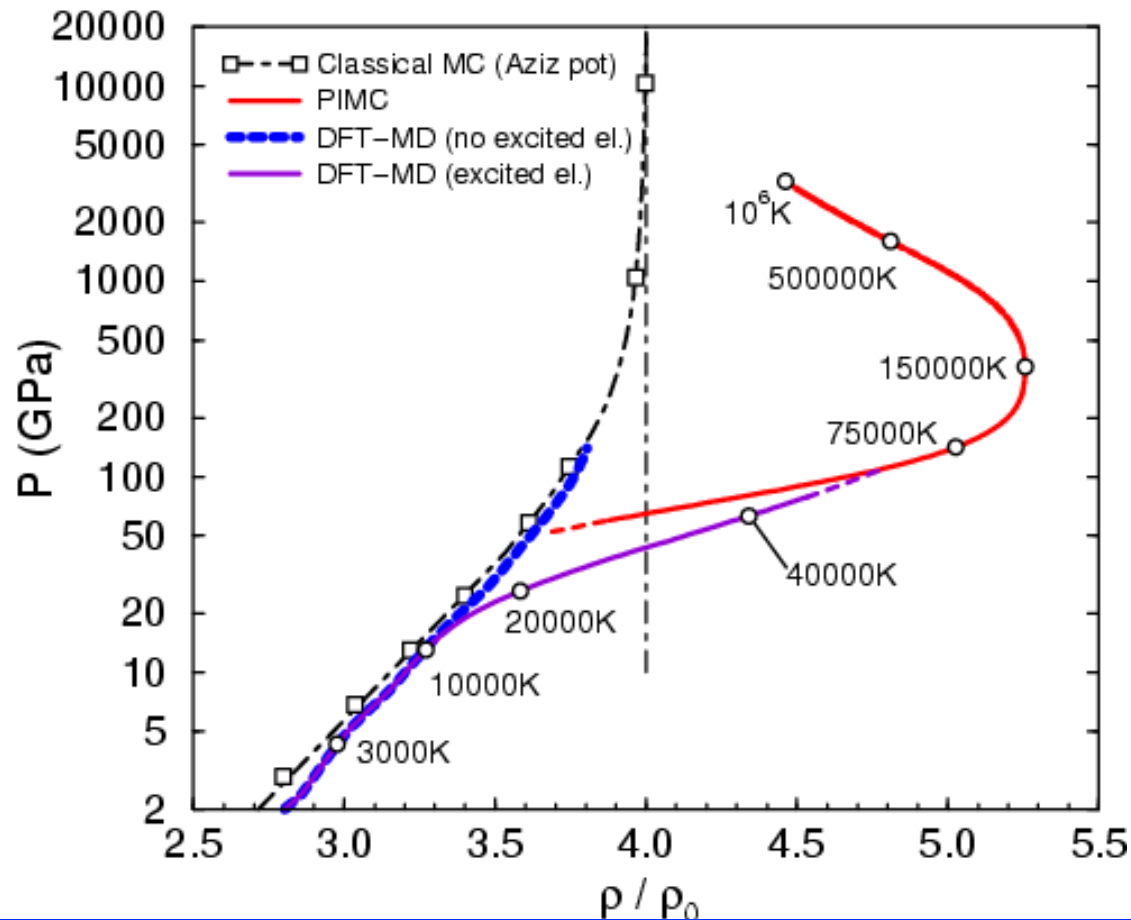
Classical MC simulation using the Aziz pair potential track the DFT-MD data reasonably well  $\Rightarrow$  compression less than 4-fold the initial density.

# PIMC results yield more than 5-fold compression.



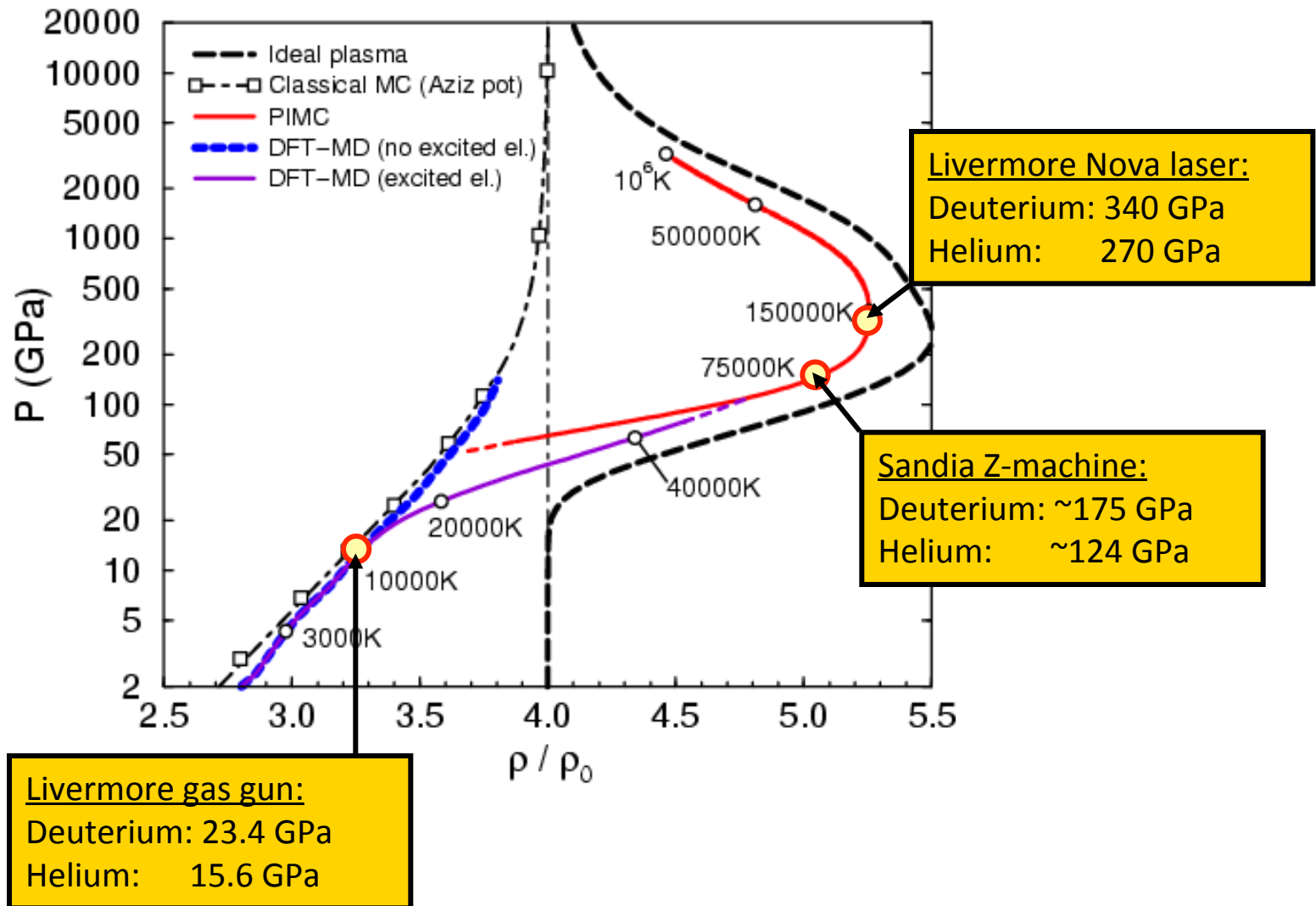
This high precompression is surprising because both PIMC and DFT-MD gave about 4-fold compression for hydrogen.

# Add electronic excitations to DFT-EOS improves agreement with PIMC results.



For a number of MD configurations, quasi-static finite-temperature electronic corrections to the EOS increase the compressibility.

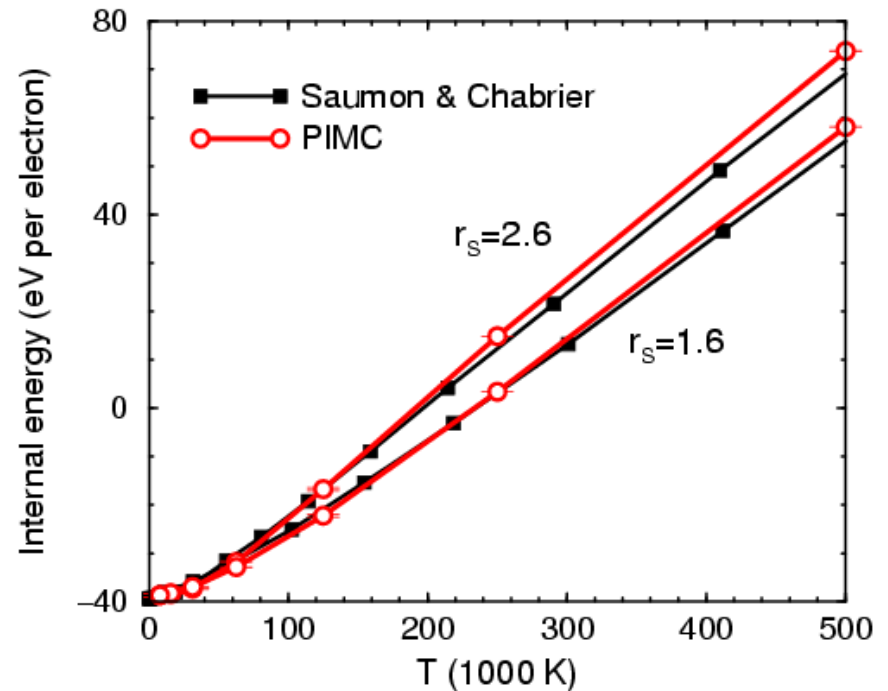
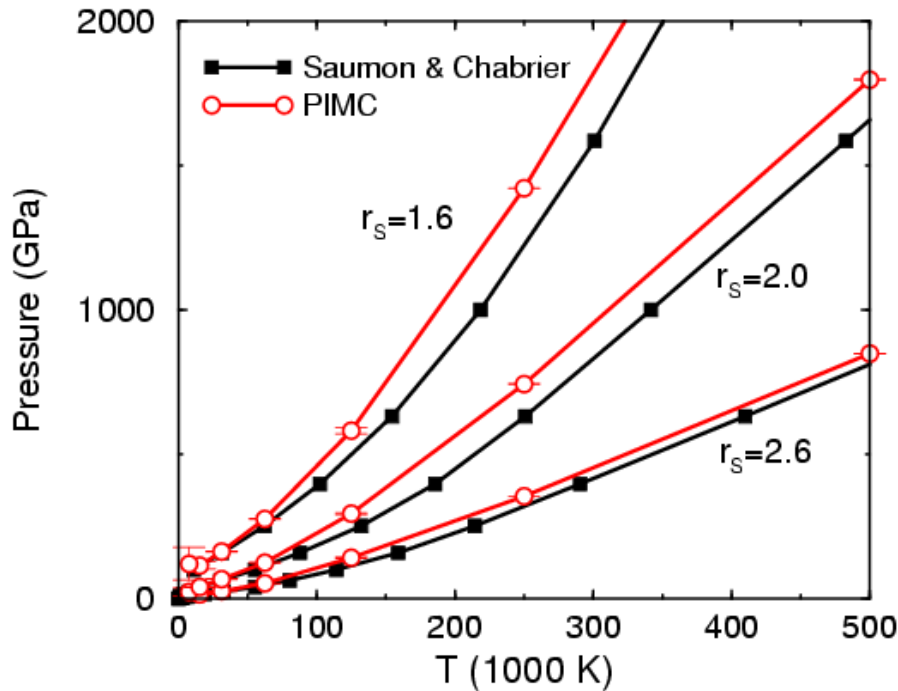
# Laser and Z-machine can probe regime of 5-fold compression





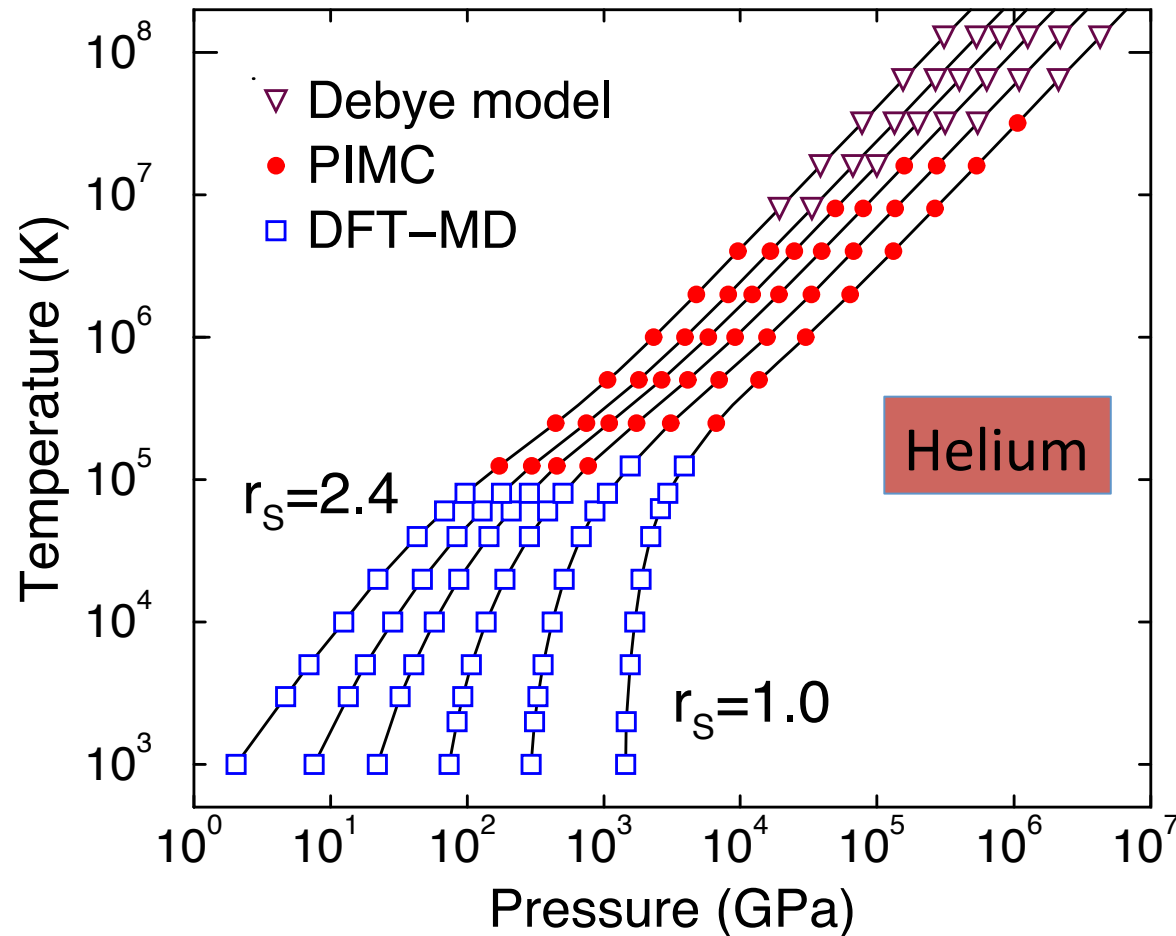
# PIMC Calculations of the Helium EOS

Comparison with Saumon & Chabrier free energy model



The pressure is severely **underestimated** by the SC model.

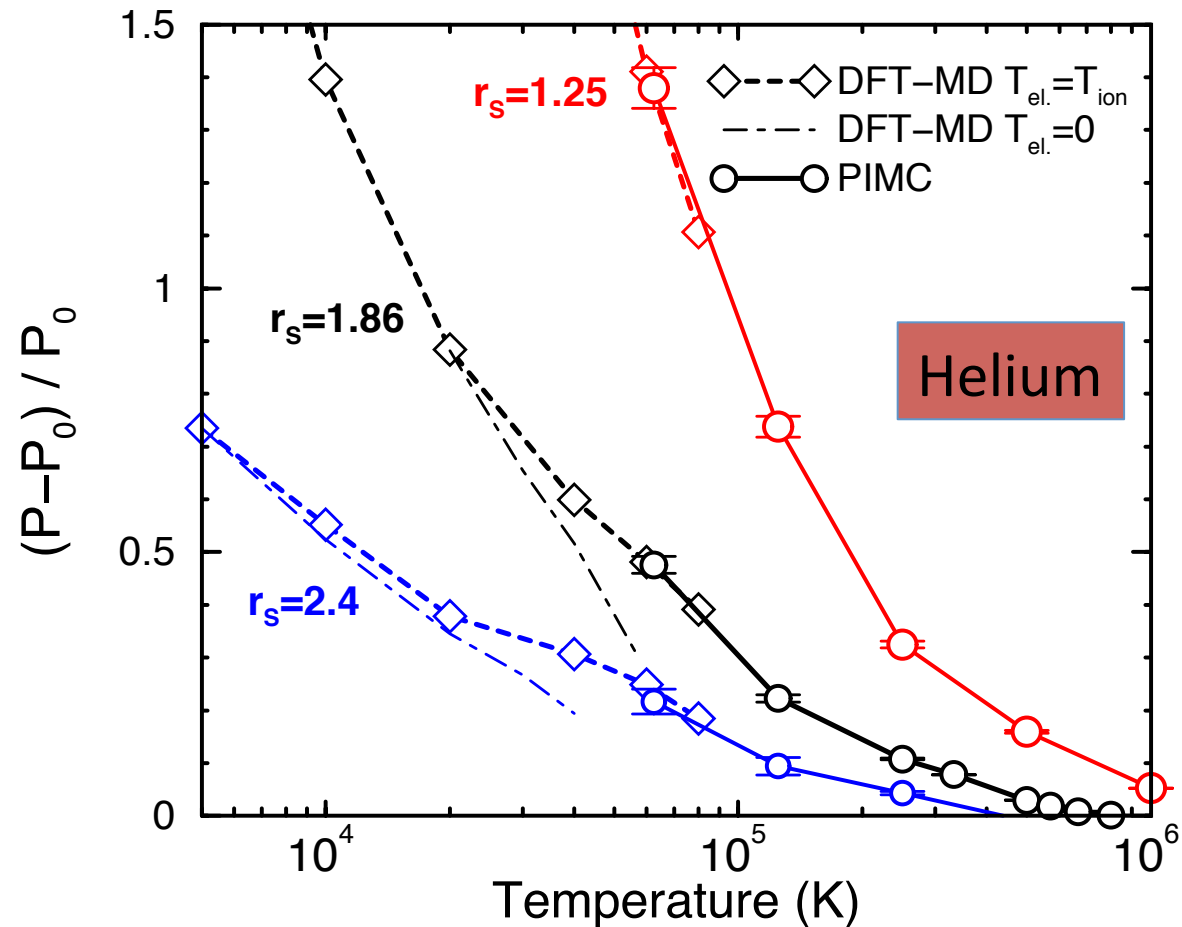
# For Helium, **PIMC** and **DFT-MD** Simulations have been combined to make one consistent EOS table



B. Militzer, *Phys. Rev. B* **79** (2009) 155105

B. Militzer, *Phys. Rev. Lett.* **97** (2006) 175501

# For Helium, **PIMC** and **DFT-MD** Simulations have been combined to make one consistent EOS table

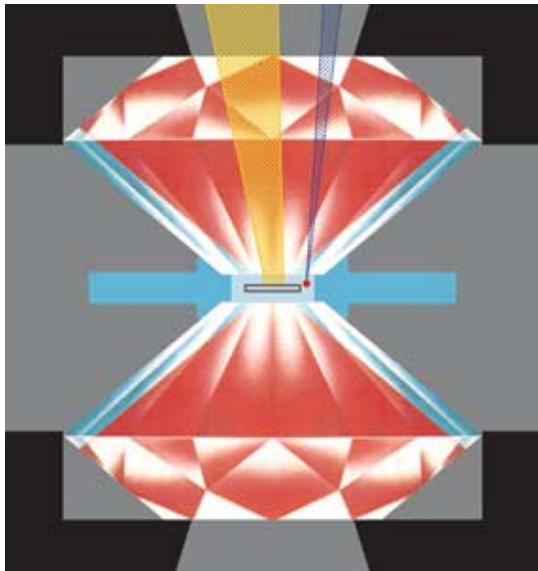


B. Militzer, *Phys. Rev. B* **79** (2009) 155105

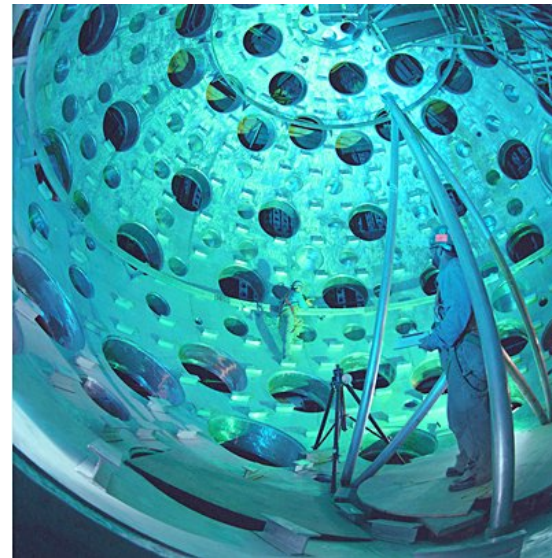
B. Militzer, *Phys. Rev. Lett.* **97** (2006) 175501

# New Experimental Technique: Combination of **Static** and **Dynamic** Compression

1) Static compression  
Diamond anvil cell

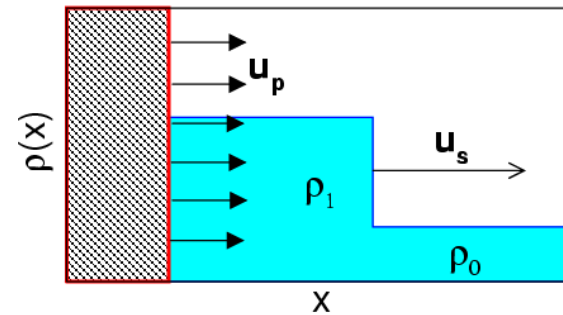
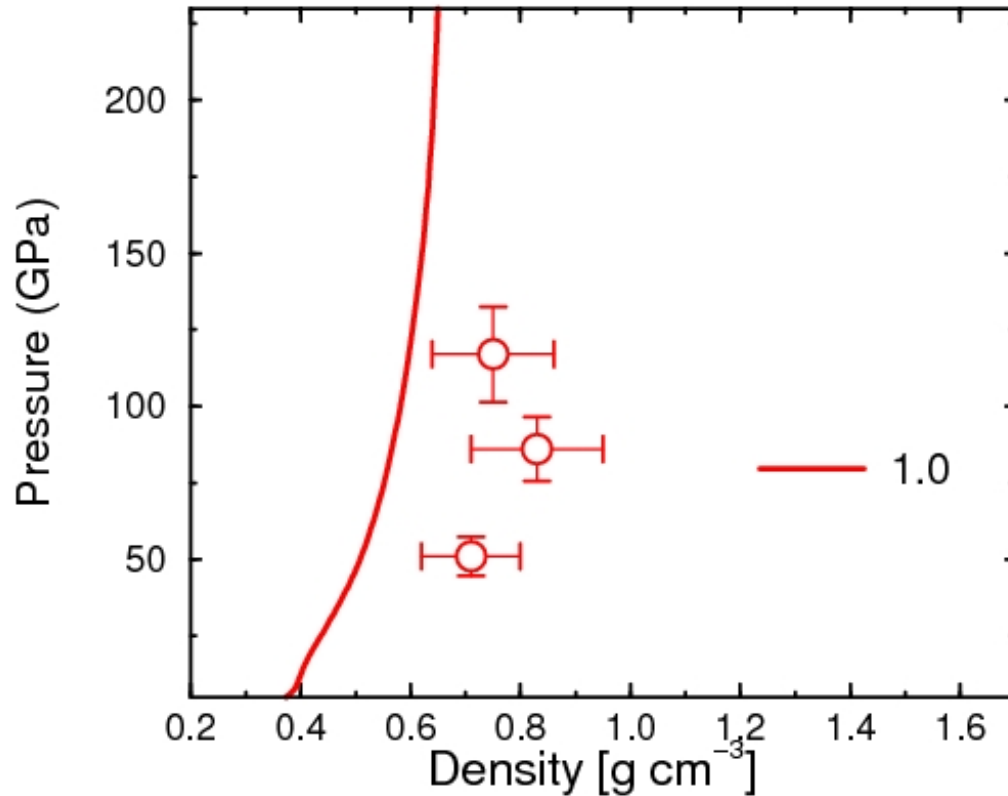


2) Dynamic shock comp.  
Laser shocks

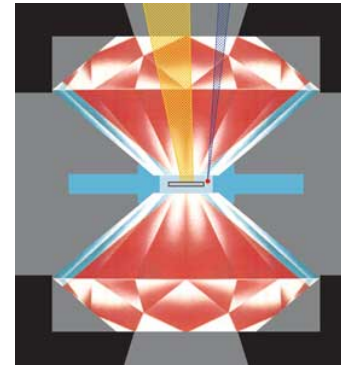


- LLNL-CEA collaboration
- Samples are **precompressed** in modified diamond anvil cell
- Precompression up to 1.5 GPa = 15 kbar

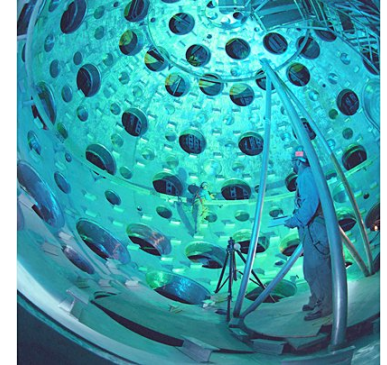
# Comparison of PIMC Simulations with Laser Shock Experiments on Helium



Diamond anvil cell

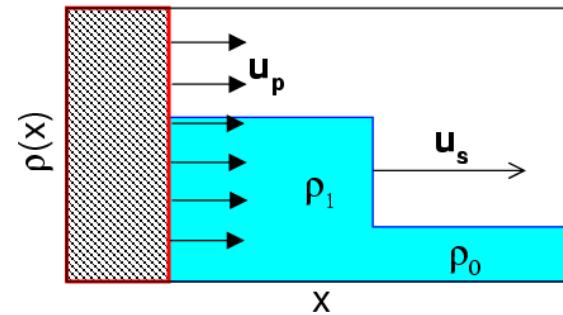
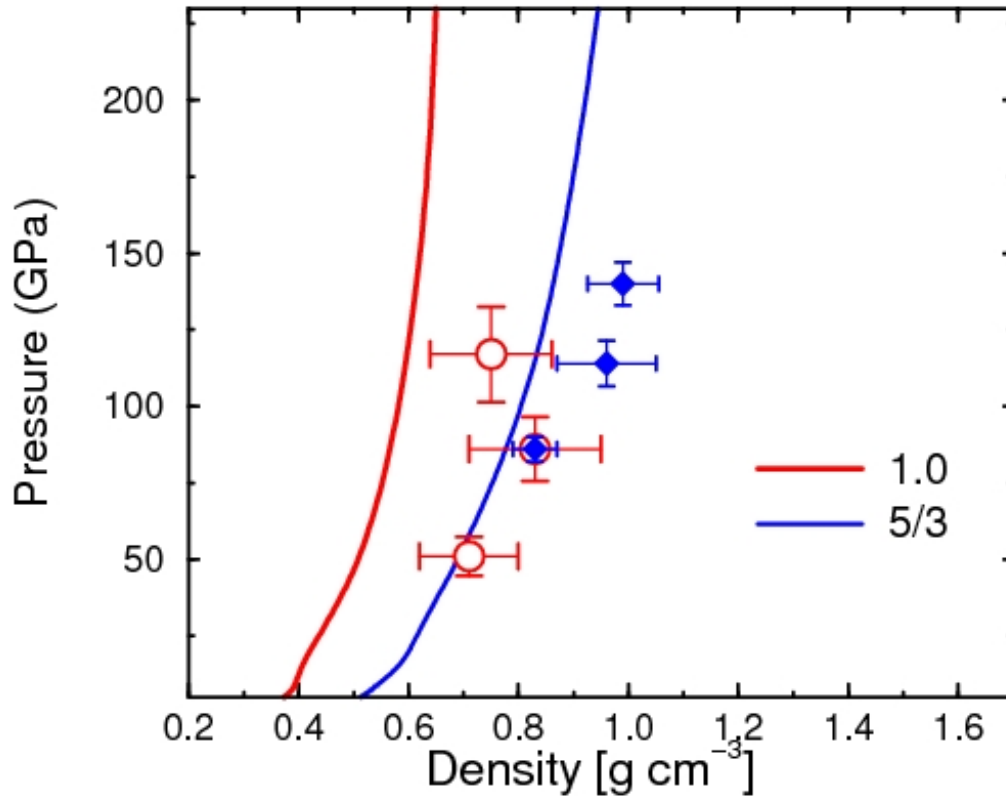


Laser shocks

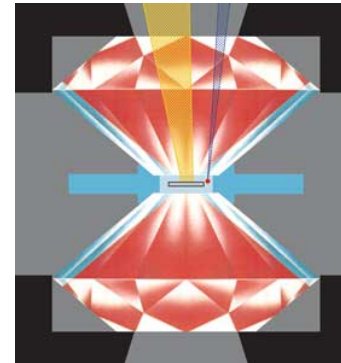


Theory: Militzer, *Physical Review Letters*, **97** (2006) 175501;  
Exp: Eggert *et al.* *Physical Review Letters*, **100** (2008) 124503.

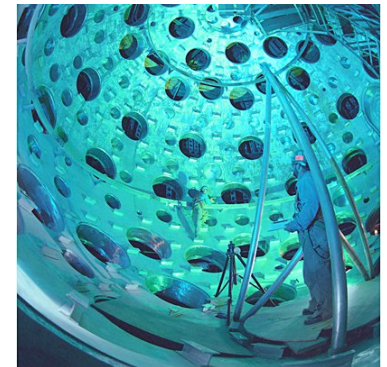
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Diamond anvil cell

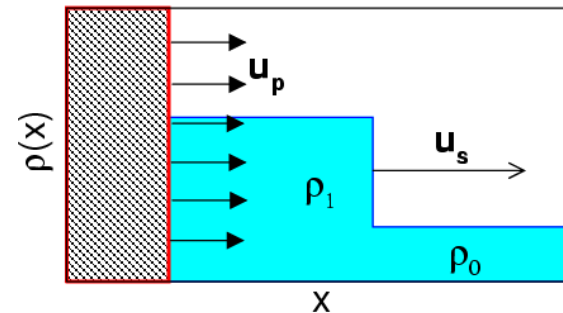
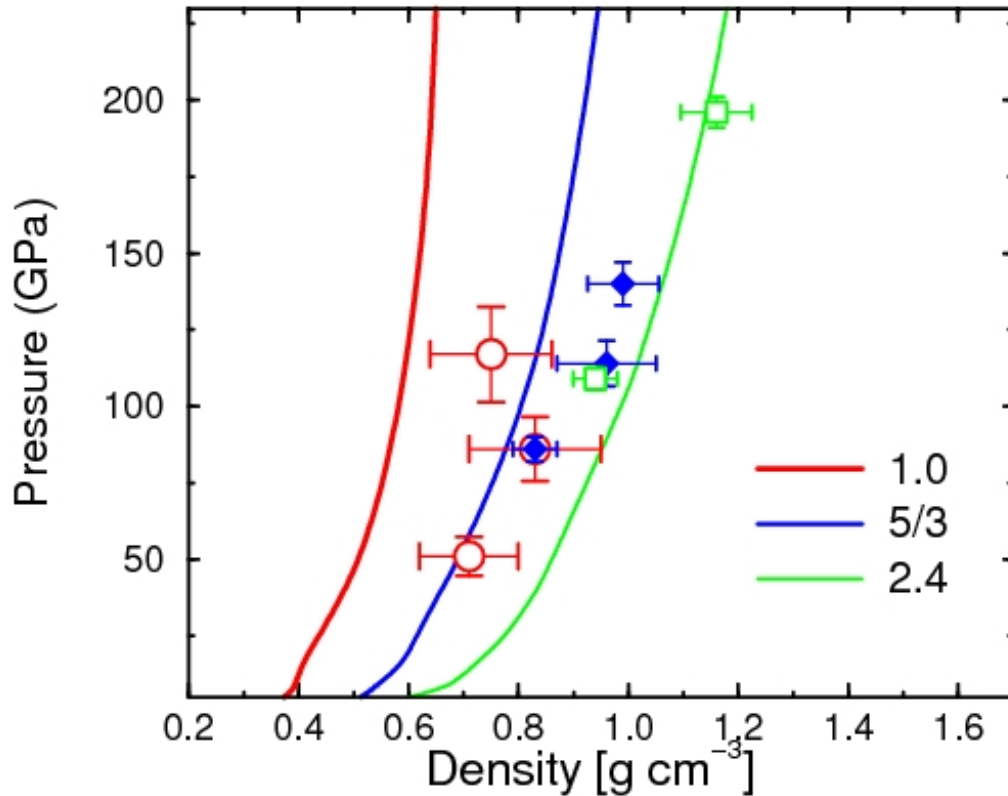


Laser shocks

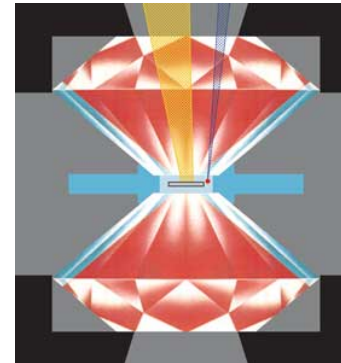


Theory: Militzer, *Physical Review Letters*, **97** (2006) 175501;  
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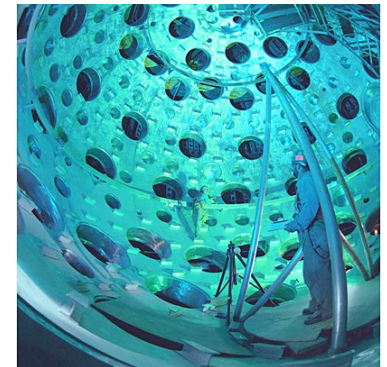
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Diamond anvil cell

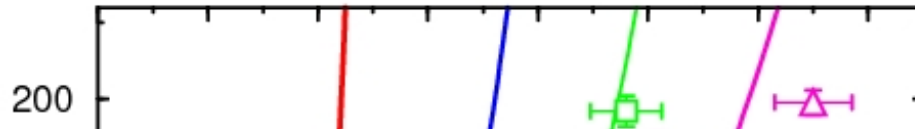


Laser shocks



Theory: Militzer, *Physical Review Letters*, **97** (2006) 175501;  
Exp: Eggert *et al.* *Physical Review Letters*, **100** (2008) 124503.

# Comparison of PIMC Simulations with Laser Shock Experiments on Helium



Principal Hugoniot:

PRL 103, 225501 (2009)

PHYSICAL REVIEW LETTERS

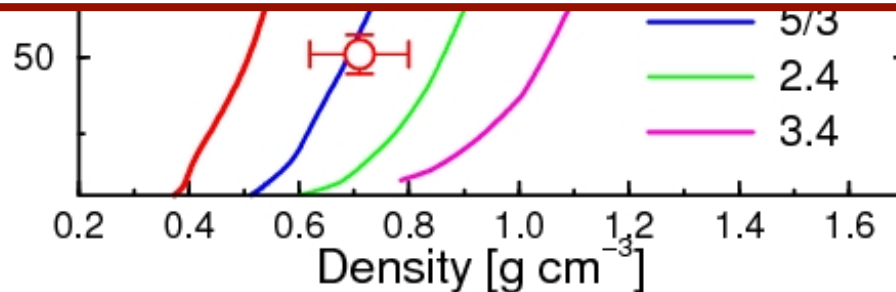
week ending  
27 NOVEMBER 2009

## Shock Compression of Quartz to 1.6 TPa: Redefining a Pressure Standard

M. D. Knudson and M. P. Desjarlais

*Sandia National Laboratories, Albuquerque, New Mexico 87185-1195, USA*

(Received 25 June 2009; published 24 November 2009)



PIMC and experiment agree.

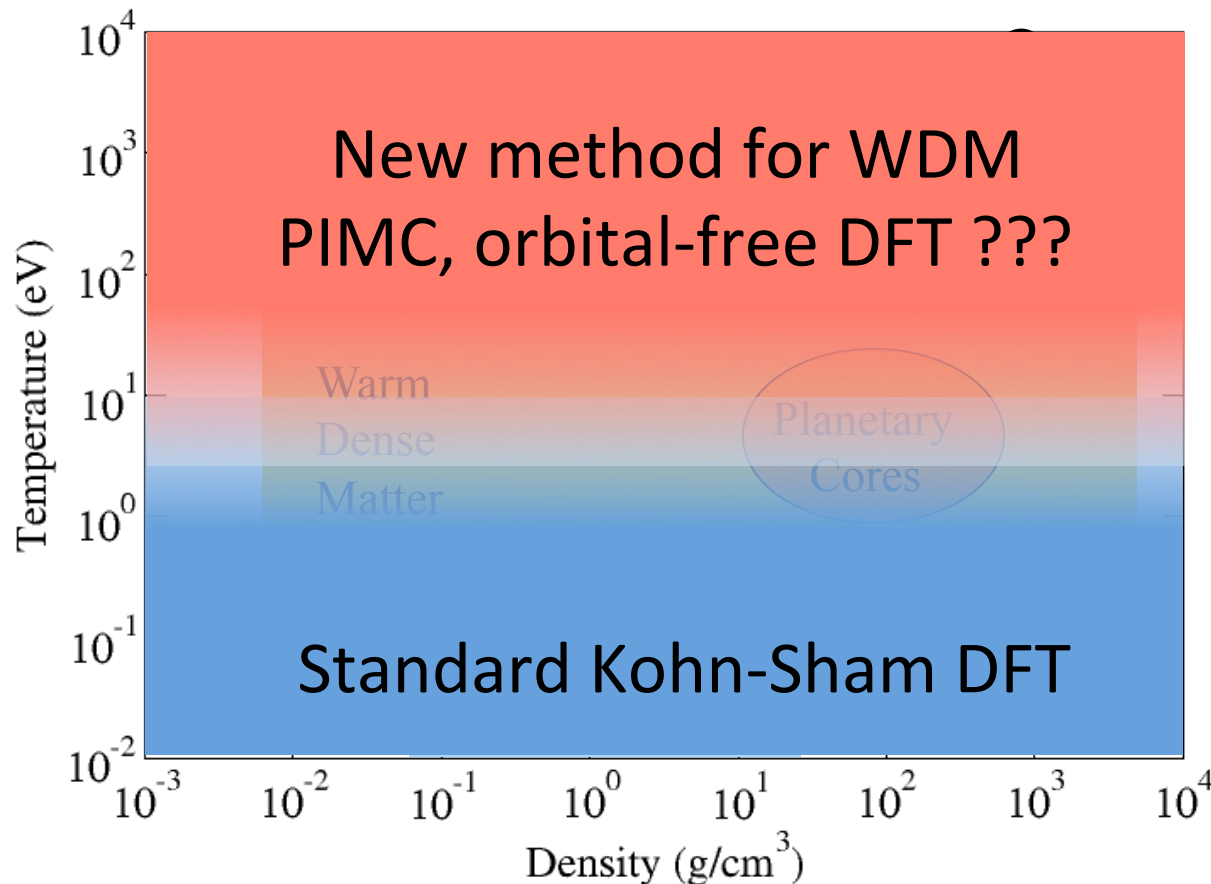
Theory: Militzer, *Physical Review Letters*, **97** (2006) 175501;

Exp: Eggert *et al.* *Physical Review Letters*, 100 (2008) 124503.



# ***VI. PIMC of Carbon and Water Plasmas***

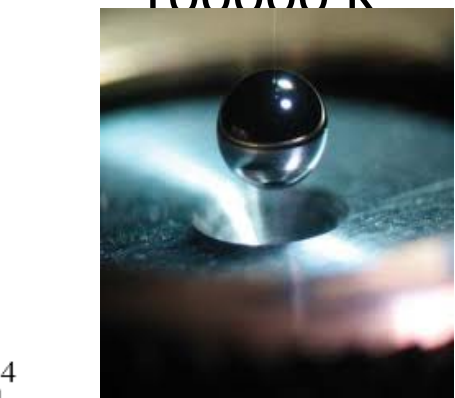
# Regime of Warm Dense Matter requires new simulation techniques – Application ICF experiments



ICF Hohraum



ICF Capsule



Effects of bonding, ionization, exchange and correlation, and quantum degeneracy all important. Carbon is a promising ablator for Inertial confinement fusion (ICF). We are working with LLNL on carbon EOS.

# Why were there no PIMC calculations for elements heavier than helium until 2012?

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Problem 1: **Nonlocal pseudopotentials** in fermionic path integrals

$$\langle R | \hat{\rho}_{n.l.} | R' \rangle = \langle R | e^{-\tau[\hat{T} + \hat{V}_{n.l.}]} | R' \rangle$$

→ **Sign problem** even for the 1-particle scattering problem.

Problem 2: **More accurate nodes** needed at low temperature.

Problem 3: Acceptance ratio of **reference point moves** decreases at low temperature. Low sampling efficiency.

Hydrogen:  $T > 0.1 \times T_{\text{fermi}}$

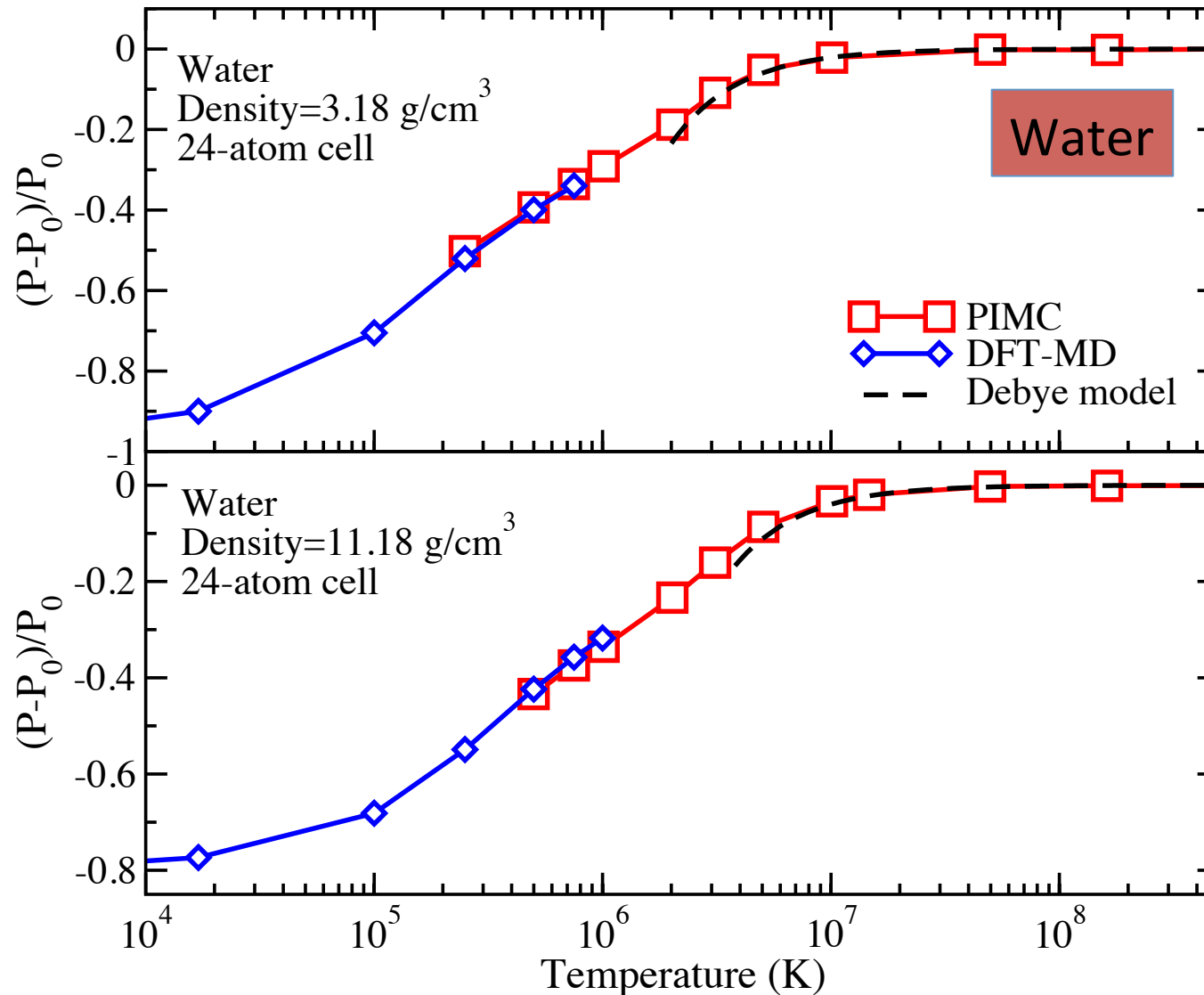
Alternative: Coupled Electron-Ion Monte Carlo (Delaney, Pierleoni, Ceperley)

Reintroduce Born-Oppenheimer approximation:

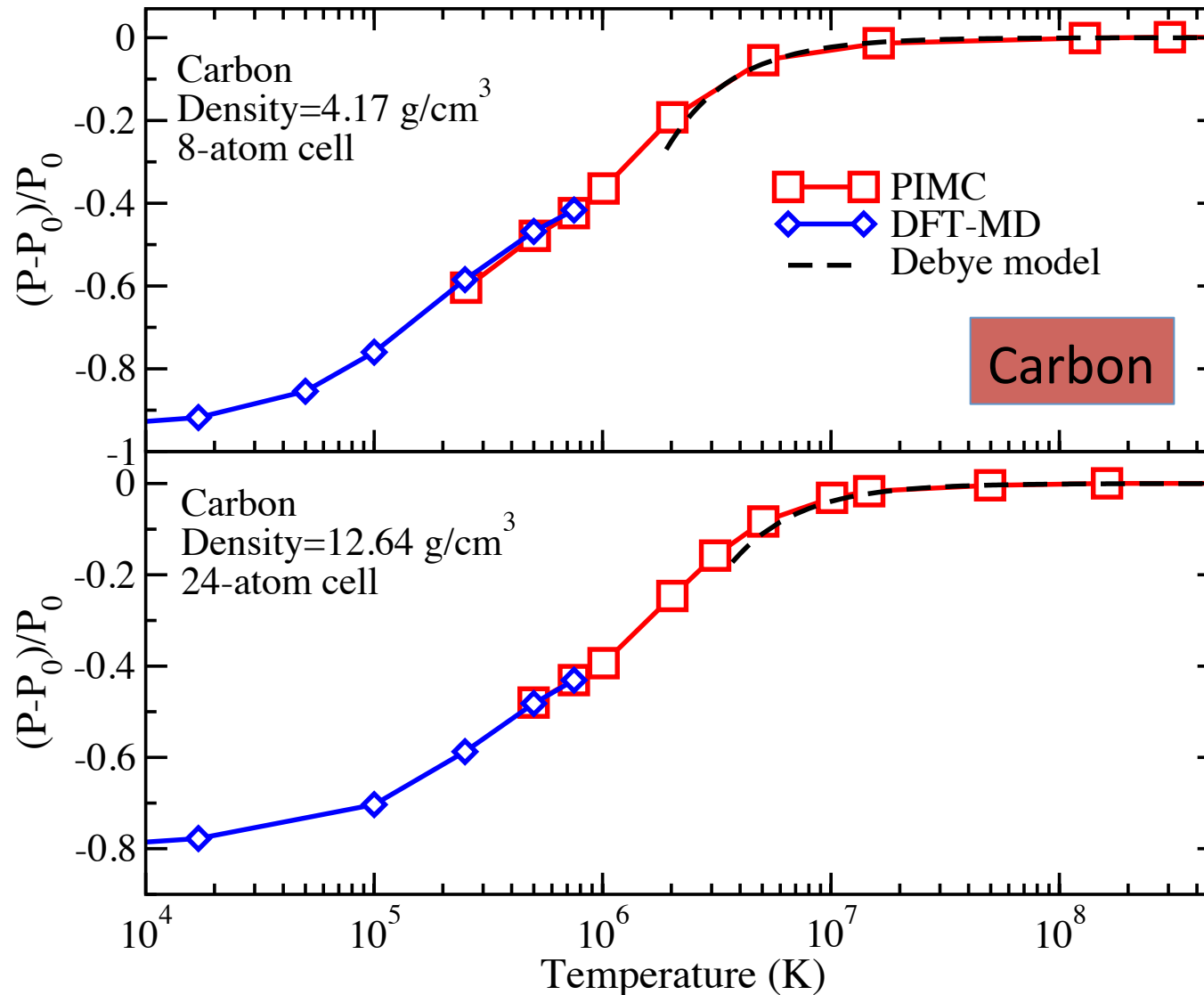
Classical MC for the ions ( $T_{\text{ion}} > 0$ )

QMC for the electrons ( $T_{\text{el}} = 0$ )

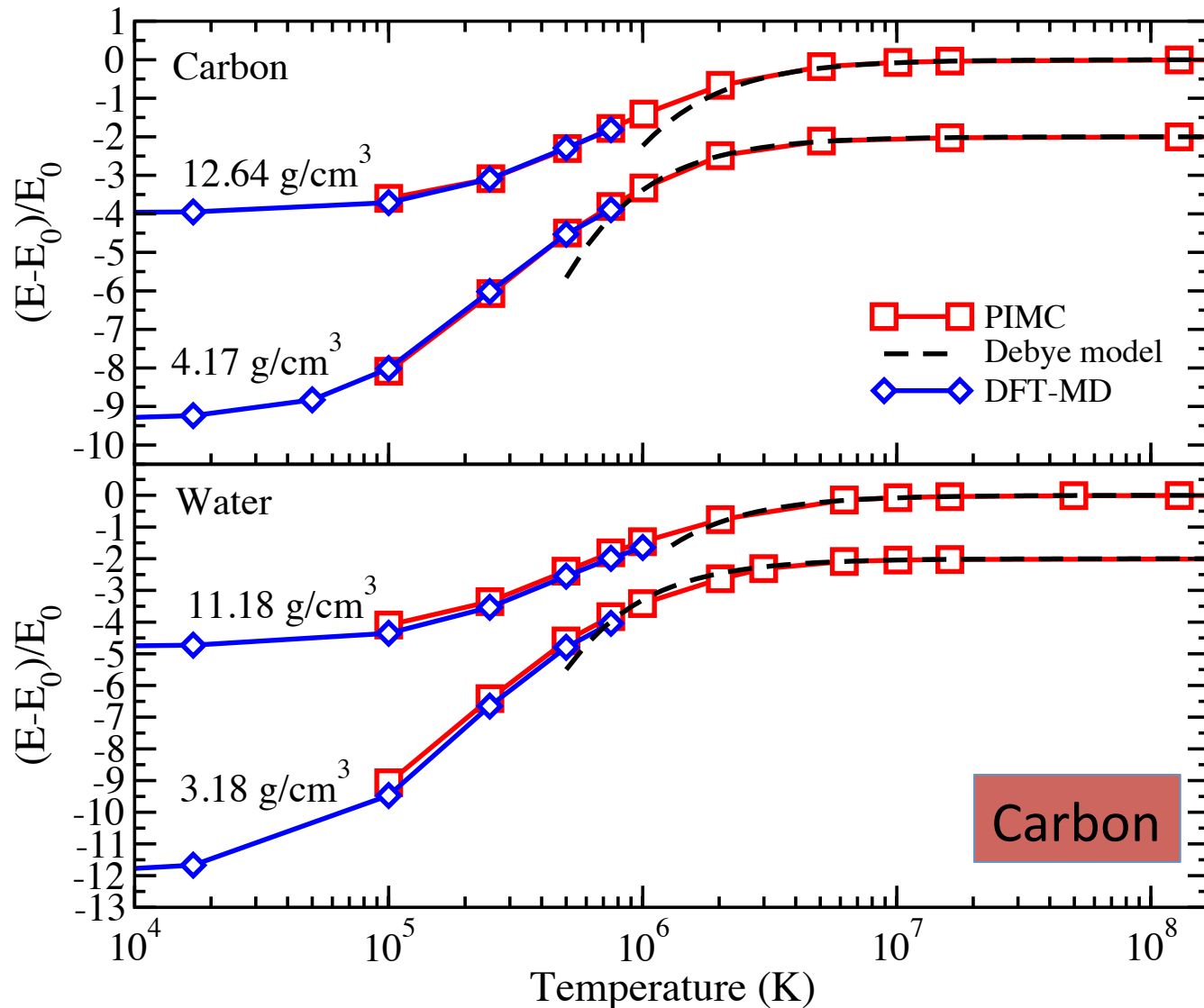
# First Path Integral Monte Carlo Simulations for Heavier Elements Fill this Gap in Temperature



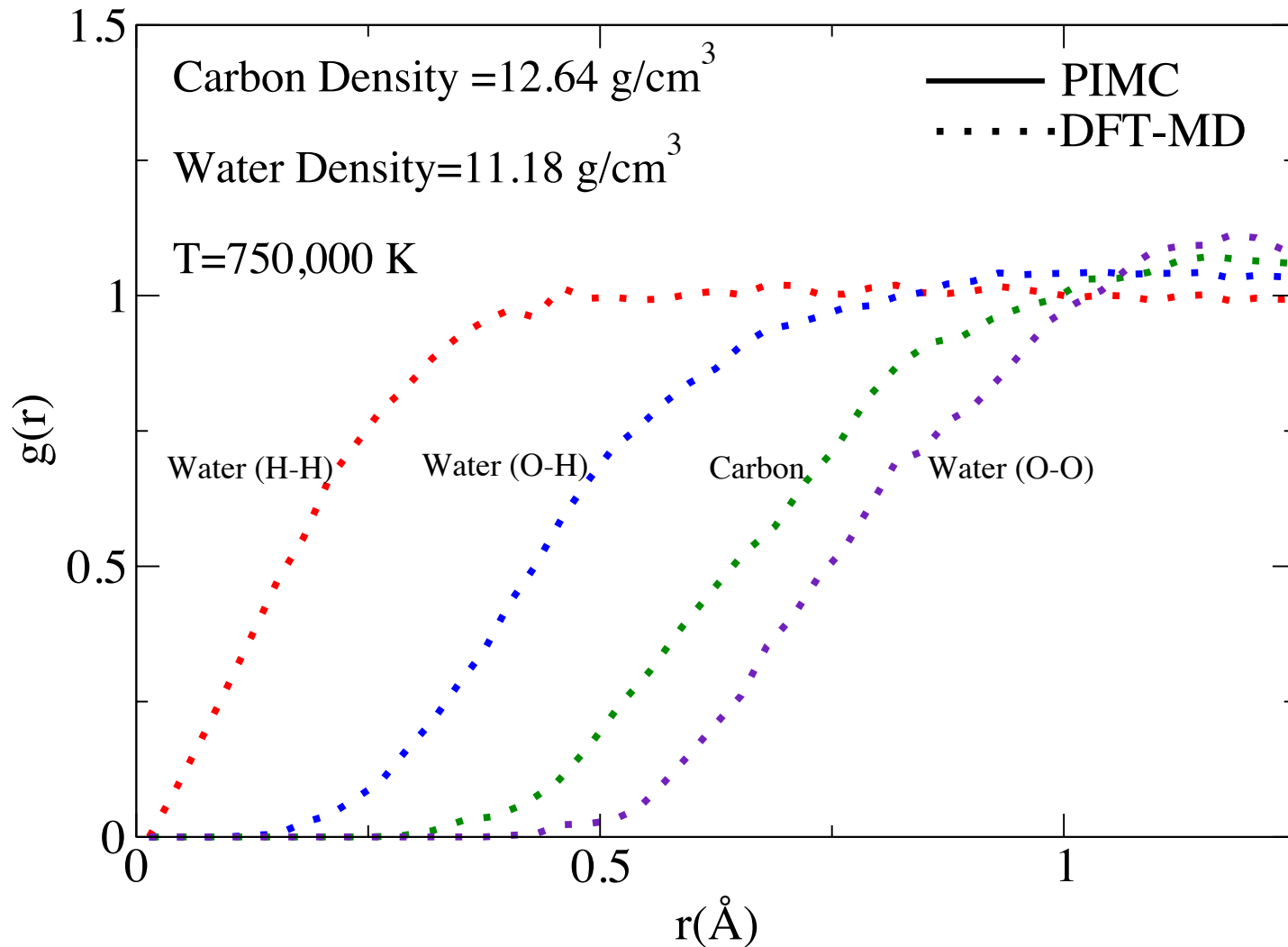
# Again **Path Integral Monte Carlo** bridges the Gap in T between DFT-MD and the Debye Model



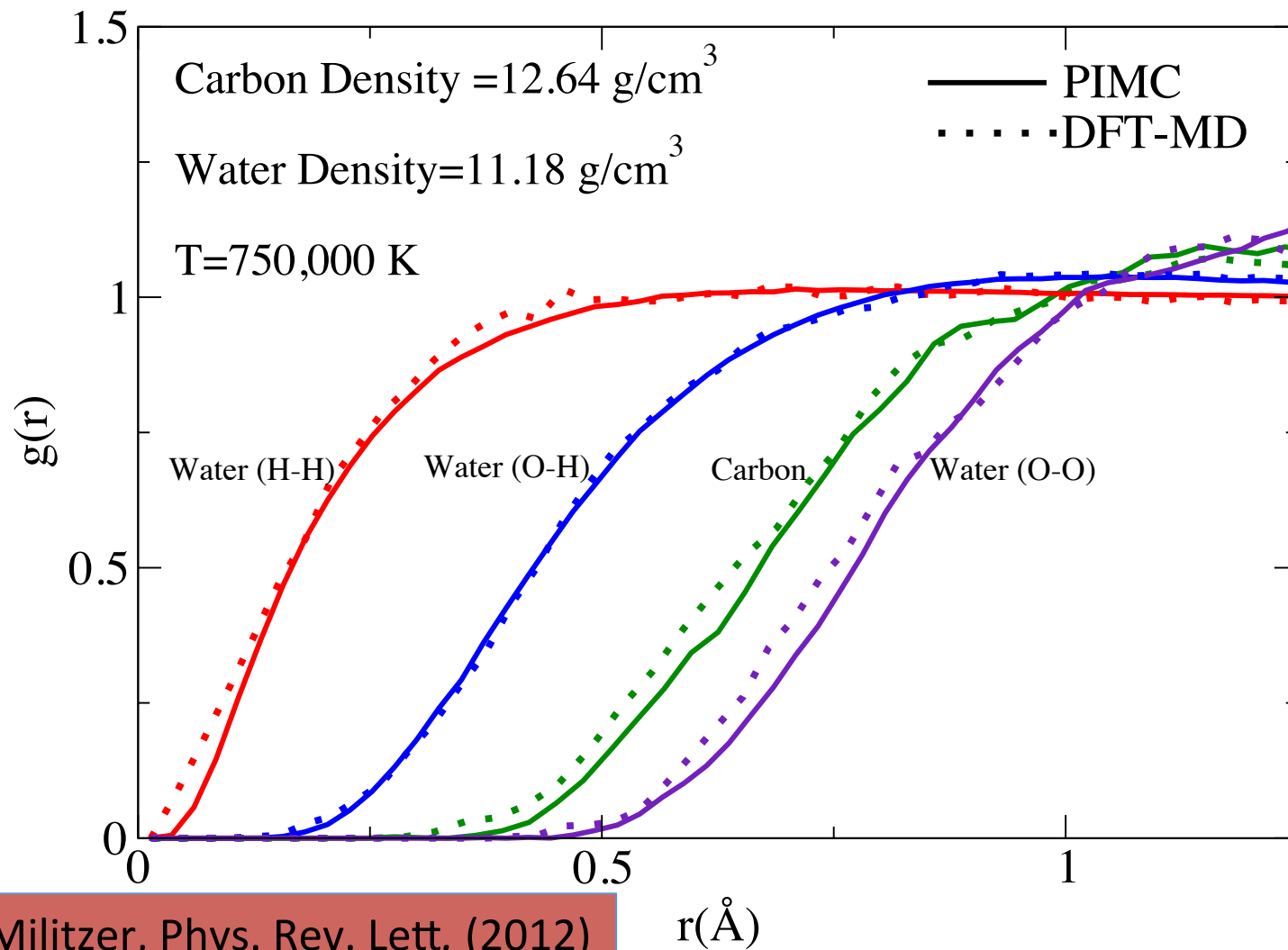
# Path Integral Monte Carlo bridges the Gap in Internal Energy vs Temperature for Water and Carbon Plasmas



# Study Structural Properties: **Pair Correlation Functions** for Water and Carbon Plasmas

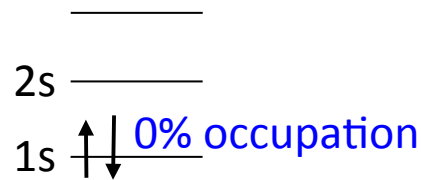


# Path Integral Monte Carlo and DFT-MD are in very good agreement

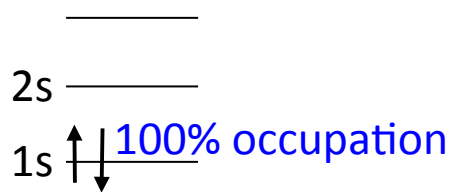




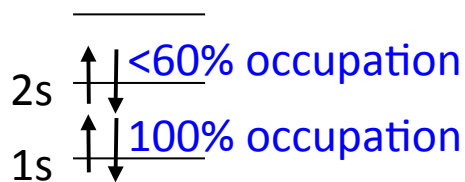
# Why do free-particle nodes work for PIMC simulations of first-row elements?



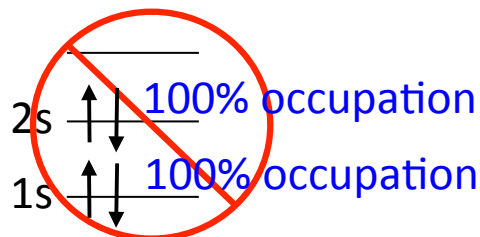
Core electrons are **fully ionized**.  
Free-particles nodes are **ideal!**



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



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.



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



*The End*