

Recent Progress in simulations of dense quantum plasmas and warm dense matter

Michael Bonitz, Paul Hamann, Tobias Dornheim[†], Zhandos Moldabekov[†], Alexey Filinov,
Jan Vorberger*, and Pavel Levashov

in collaboration with Frank Graziani**, and Christopher Makai

Institute of Theoretical Physics and Astrophysics, Kiel University

[†] Center for Advanced Systems Understanding, * Helmholtz-Zentrum Dresden-Rossendorf

** Lawrence Livermore National Lab

DPG Meeting, Mainz, March 30 2022

Symposium *Plasmas in the Universe*

pdf at www.theo-physik.uni-kiel.de/bonitz/research.html

DFG

DAAD

HLRN



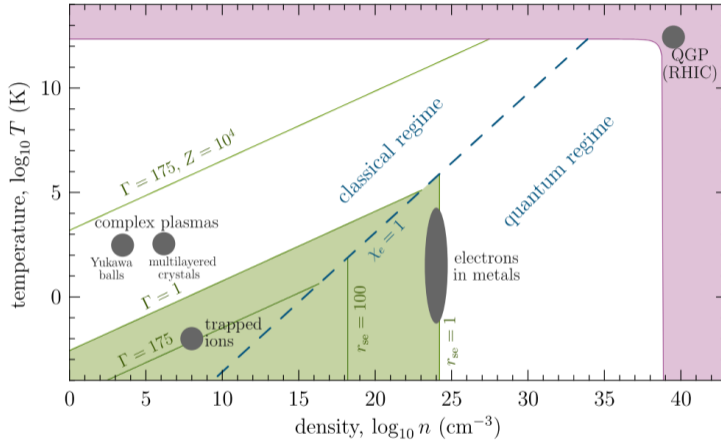


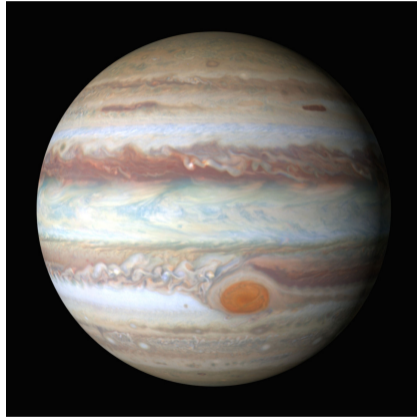
Figure 1. Examples of strongly correlated systems in thermodynamic equilibrium include complex plasmas, trapped ions and the QGP extending along the outer (pink) area, dot shows the conditions at RHIC). Prominent properties of all systems can be quantified by a few dimensionless parameters: the coupling parameter Γ , equation (2), the degeneracy parameter χ , equation (3), and the Brueckner parameter r_s , equation (4).

V. Filinov *et al.*, *Color path-integral Monte-Carlo simulations of quark-gluon plasma: Thermodynamic and transport properties*, Phys. Rev. C **87**, 035207 (2013). **Similar physics and methods.**

Warm Dense Matter: Occurrences and Applications [Andrew NG (2000): "missing link between CM, plasmas"]

▶ **Astrophysics:**

- ▶ Giant planet interiors (e.g. Jupiter)
- ▶ Brown dwarfs
- ▶ Earth interior, Meteor Impacts
- ▶ Recently discovered planets



[Source: Sci-News.com \[Img4\]](#)

Warm Dense Matter: Occurrences and Applications [Andrew NG (2000): "missing link between CM, plasmas"]

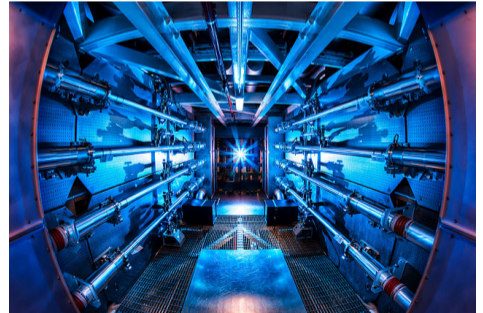
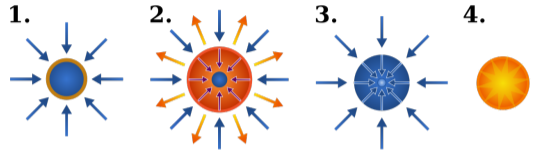
▶ Astrophysics:

- ▶ Giant planet interiors (e.g. Jupiter)
- ▶ Brown dwarfs
- ▶ Earth interior, Meteor Impacts
- ▶ Recently discovered planets

▶ Laboratory Experiments, shock compression:

- ▶ Lasers, FELs, Z-pinch, ion beams
- ▶ Properties of matter under extreme conditions
- ▶ major driver: Inertial confinement fusion

Potential abundance of clean energy!



Source: en.wikipedia.org [Img5] and arstechnica.com [Img6]

Warm Dense Matter: Occurrences and Applications [Andrew NG (2000): "missing link between CM, plasmas"]

▶ Astrophysics:

- ▶ Giant planet interiors (e.g. Jupiter)
- ▶ Brown dwarfs
- ▶ Earth interior, Meteor Impacts
- ▶ Recently discovered planets

▶ Laboratory Experiments, shock compression:

- ▶ Lasers, FELs, Z-pinch, ion beams
- ▶ Properties of matter under extreme conditions
- ▶ major driver: Inertial confinement fusion

Potential abundance of clean energy!

US: NIF, Omega (Rochester), LCLS (Stanford): Fundamental research into WDM properties: → Equation of state, $S(\mathbf{q}, \omega)$, conductivity etc.

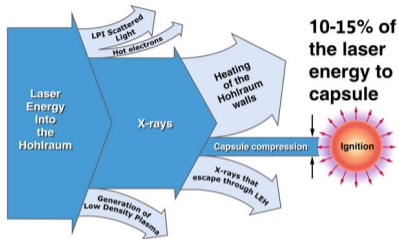
National Ignition Facility (Livermore, California)



area: $70000m^2$
cost: ~ 1 billion Dollar

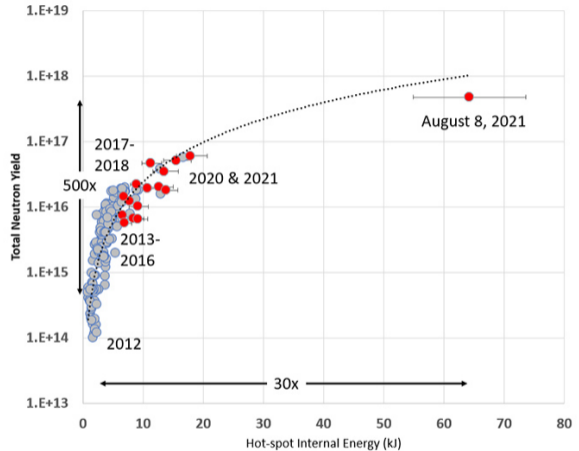
Source: C. Stolz, *Phil. Trans. R. Soc. A* **370**, 4115 (2012) [Img7]

Progress in Inertial Confinement Fusion



continuous optimization of target design, pulse shape etc.

Record shot on August 8 2021: 1.92 MJ UV laser energy
source: <https://lasers.llnl.gov/news/hybrid-experiments-drive-nif-toward-ignition>

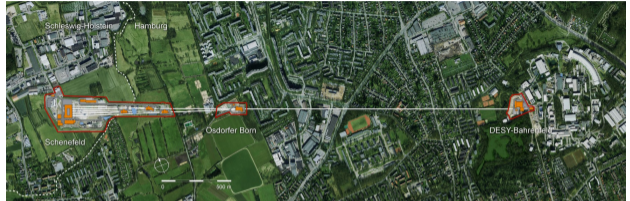


The “Hybrid-E experiment” on Aug. 8 achieved a hot-spot absorbed energy of about 65 kJ—about 20 kJ from the implosion, and the rest from compression “self-heating” from the fusion reactions (self-sustained burn). 1.35 MJ fusion energy yield, corresponds to 70% of ignition threshold (NAS criterion).

Facilities for WDM experiments in Europe and Asia:

Free electron lasers:

- ▶ **FLASH** (DESY, Hamburg)
- ▶ **European X-ray Free-Electron Laser**, Hamburg – Schenefeld
- ▶ **HIBEF Beamline and consortium. 2021 first successful experiments**
- ▶ **Fermi** (Triest, Italy)
- ▶ **SACLA** (Riken, Japan)

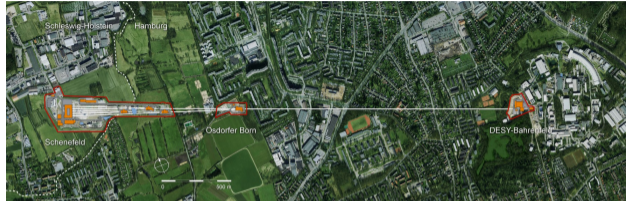


source: photon-science.desy.de

Facilities for WDM experiments in Europe and Asia:

Free electron lasers:

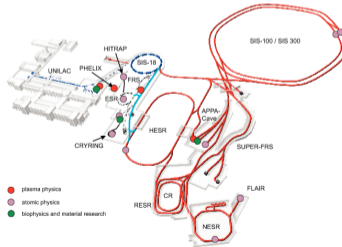
- ▶ **FLASH** (DESY, Hamburg)
- ▶ **European X-ray Free-Electron Laser**, Hamburg – Schenefeld
- ▶ **HIBEF Beamline and consortium. 2021 first successful experiments**
- ▶ **Fermi** (Triest, Italy)
- ▶ **SACLA** (Riken, Japan)



source: photon-science.desy.de

Heavy ion beams:

- ▶ Facility for **Antiproton and Ion Research**, Darmstadt
- ▶ Construction started in 2017
- ▶ Heavy ion beams: Isochoric heating up to $\sim 10^6 K$



source: inspirehep.net



source: dw.com

Facilities for WDM experiments in Europe and Asia:

Free electron lasers:

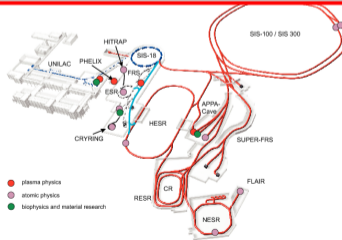
- ▶ **FLASH** (DESY, Hamburg)
- ▶ **European X-ray Free-Electron Laser**, Hamburg – Schenefeld
- ▶ **HIBEF Beamline and consortium. 2021 first successful experiments**
- ▶ **Fermi** (Triest, Italy)
- ▶ **SACLAY**



Warm dense matter: indeed a HOT topic

Heavy ion beams:

- ▶ Facility for **Antiproton and Ion Research**, Darmstadt
- ▶ Construction started in 2017
- ▶ Heavy ion beams: Isochoric heating up to $\sim 10^6 K$



source: inspirehep.net



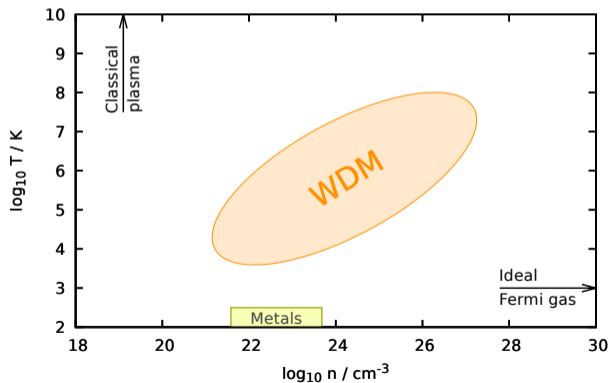
source: dw.com

Warm Dense Matter and quantum plasmas: relevant parameters

► Extreme and exotic state of matter:

- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

Source: T. Dornheim, S. Groth, and M. Bonitz,
Phys. Reports **744**, 1-86 (2018)



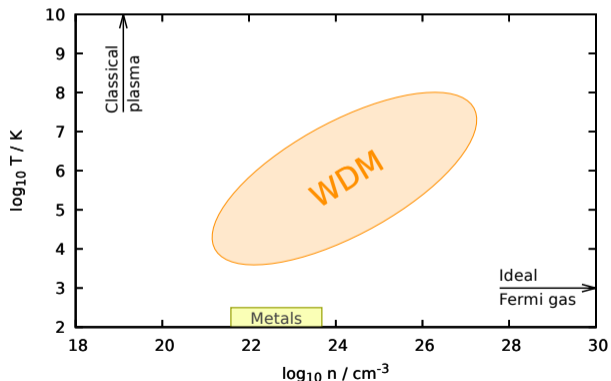
Warm Dense Matter and quantum plasmas: relevant parameters

▶ Extreme and exotic state of matter:

- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

▶ Characteristic parameters:

[Source: T. Dornheim, S. Groth, and M. Bonitz, Phys. Reports 744, 1-86 \(2018\)](#)



Warm Dense Matter and quantum plasmas: relevant parameters

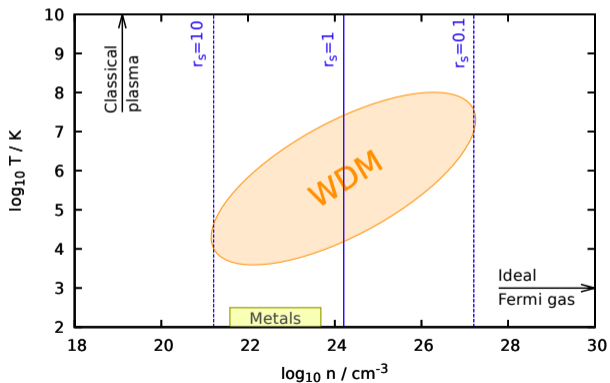
▶ Extreme and exotic state of matter:

- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$

Source: T. Dornheim, S. Groth, and M. Bonitz,
Phys. Reports **744**, 1-86 (2018)



Warm Dense Matter and quantum plasmas: relevant parameters

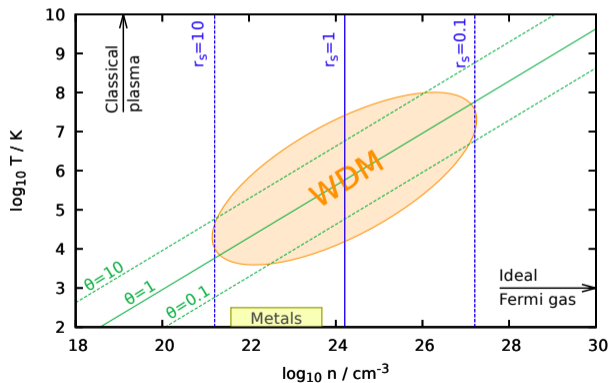
▶ Extreme and exotic state of matter:

- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$
- ▶ Degeneracy temperature $\theta = k_B T/E_F \sim 1$
 - $\theta < 1$: quantum plasma,
 - $\theta > 1$: classical plasma

Source: T. Dornheim, S. Groth, and M. Bonitz,
Phys. Reports **744**, 1-86 (2018)



Warm Dense Matter and quantum plasmas: relevant parameters

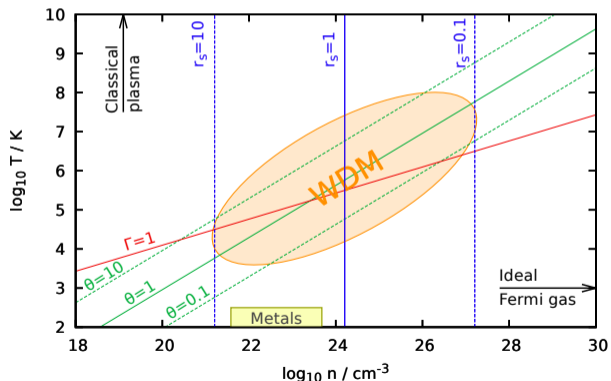
▶ Extreme and exotic state of matter:

- High temperature: $T \sim 10^3 - 10^8$ K
- Extreme density: $n \sim 10^{21} - 10^{27}$ cm⁻³

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$
- ▶ Degeneracy temperature $\theta = k_B T/E_F \sim 1$
 $\theta < 1$: quantum plasma,
 $\theta > 1$: classical plasma
- ▶ Classical coupling parameter $\Gamma = e^2/r_s k_B T \sim 1$

Source: T. Dornheim, S. Groth, and M. Bonitz,
Phys. Reports **744**, 1-86 (2018)



Warm Dense Matter and quantum plasmas: relevant parameters

▶ Extreme and exotic state of matter:

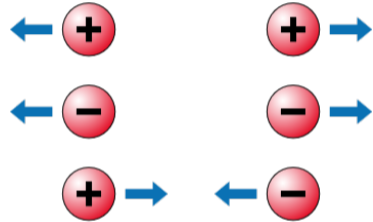
- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$
- ▶ Degeneracy temperature $\theta = k_B T/E_F \sim 1$
 - $\theta < 1$: quantum plasma,
 - $\theta > 1$: classical plasma
- ▶ Classical coupling parameter $\Gamma = e^2/r_s k_B T \sim 1$

▶ Nontrivial interplay of many effects:

- ▶ Coulomb coupling (non-ideality)



[Source: bin-br.at](http://bin-br.at) [Img1]

Warm Dense Matter and quantum plasmas: relevant parameters

▶ Extreme and exotic state of matter:

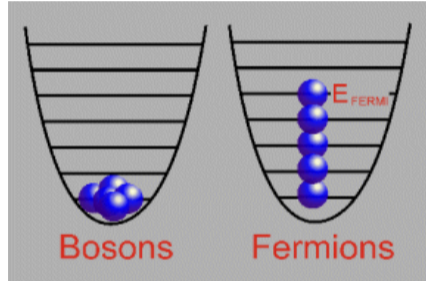
- High temperature: $T \sim 10^3 - 10^8 \text{ K}$
- Extreme density: $n \sim 10^{21} - 10^{27} \text{ cm}^{-3}$

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$
- ▶ Degeneracy temperature $\theta = k_B T/E_F \sim 1$
 - $\theta < 1$: quantum plasma,
 - $\theta > 1$: classical plasma
- ▶ Classical coupling parameter $\Gamma = e^2/r_s k_B T \sim 1$

▶ Nontrivial interplay of many effects:

- ▶ Coulomb coupling (non-ideality)
- ▶ Fermionic exchange (anti-symmetry)



Source: cidehom.com [Img2]

Warm Dense Matter and quantum plasmas: relevant parameters

▶ Extreme and exotic state of matter:

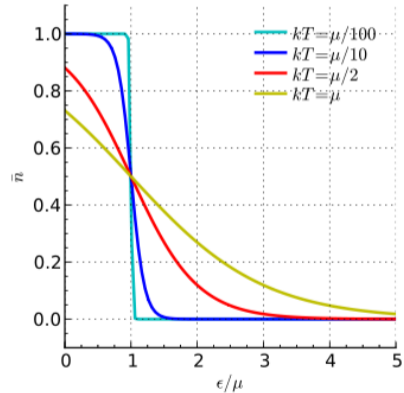
- High temperature: $T \sim 10^3 - 10^8$ K
- Extreme density: $n \sim 10^{21} - 10^{27}$ cm⁻³

▶ Characteristic parameters:

- ▶ Density (coupling) parameter $r_s = \bar{r}/a_B \sim 1$
- ▶ Degeneracy temperature $\theta = k_B T/E_F \sim 1$
 - $\theta < 1$: quantum plasma,
 - $\theta > 1$: classical plasma
- ▶ Classical coupling parameter $\Gamma = e^2/r_s k_B T \sim 1$

▶ Nontrivial interplay of many effects:

- ▶ Coulomb coupling (non-ideality)
- ▶ Fermionic exchange (anti-symmetry)
- ▶ Thermal excitations (statistical description)



Source: en.wikipedia.org [Img3]

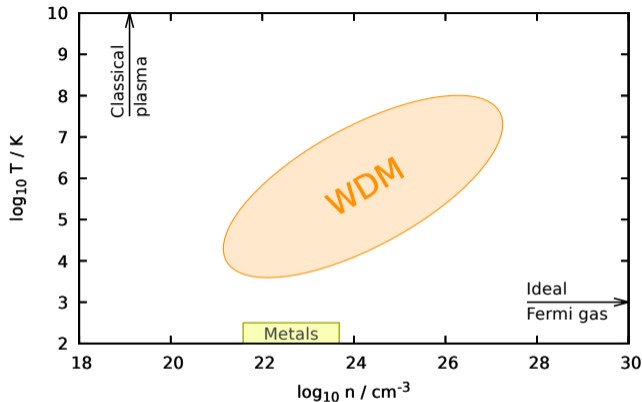
How to experimentally diagnose warm dense matter?

Warm dense matter (WDM) = highly complex mix of ...

- ▶ ... gas phase (atoms, molecules) and plasma: partial ionization, differently charged ions etc.
- ▶ ... condensed (crystalline or liquid) phase and gas (plasma) phase

WDM often subject to strong excitation ...

- ▶ ... mix of ground state and highly excited phases
- ▶ Nonequilibrium: complex time evolution



- Experimental strategies:**
1. X-ray diffraction: morphology of solid and liquid state,
 2. Transport (conductivity) and optics (e.g. X-ray absorption)
 3. Recent breakthroughs: light scattering (X-ray Thomson scattering) indirect access to temperature, density, charge state, plasmon dispersion/damping...

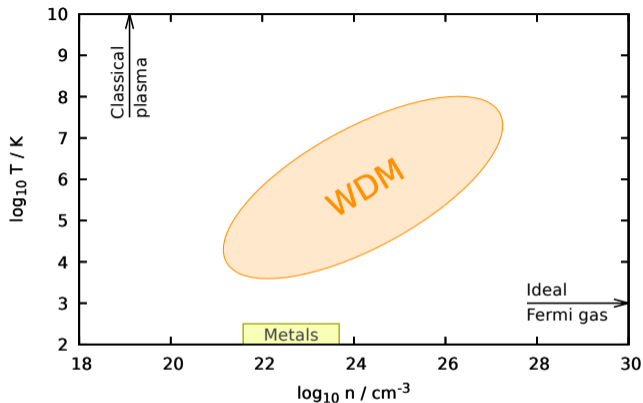
How to theoretically approach warm dense matter?

Warm dense matter (WDM) = highly complex mix of ...

- ▶ ... gas phase (atoms, molecules) and plasma: partial ionization, differently charged ions etc.
- ▶ ... condensed (crystalline or liquid) phase and gas (plasma) phase

WDM often subject to strong excitation ...

- ▶ ... mix of ground state and highly excited phases
- ▶ Nonequilibrium: complex time evolution



Theoretical strategies: 1. Make a complex (but poor) model of the entire “mess”, e.g. phenomenology, hydrodynamics, DFT, or

2. Perform an excellent description of key component: electrons

⇒ Series of recent breakthroughs: exact quantum Monte Carlo approach: from thermodynamic to dielectric and transport properties

Importance of the uniform electron gas (UEG)

Model system of Coulomb interacting quantum electrons in a uniform positive background

Ground state ($T = 0$):

- ▶ Simple model for conduction electrons in metals
- ▶ **Exchange-correlation (XC) energy:**

$$e_{xc}(r_s) = e_{\text{tot}}(r_s) - e_0(r_s)$$

- **Input for density functional theory (DFT) simulations (in LDA and GGA)**
- Parametrization¹ of $e_{xc}(r_s)$ from ground state quantum Monte Carlo data²
- this made DFT-MD the basis of modern atomic, molecular physics, chemistry, material science

¹ J.P. Perdew and A. Zunger, PRB **23**, 5048 (1981) ² D.M. Ceperley and B. Alder, PRL **45**, 566 (1980) ³ N.D. Mermin, Phys. Rev **137**, A1441 (1965)

⁴ A.Y. Potekhin and G. Chabrier, A&A **550**, A43 (2013)

Importance of the uniform electron gas (UEG)

Model system of Coulomb interacting quantum electrons in a uniform positive background

Ground state ($T = 0$):

- ▶ Simple model for conduction electrons in metals
- ▶ **Exchange-correlation (XC) energy:**

$$e_{xc}(r_s) = e_{tot}(r_s) - e_0(r_s)$$

- **Input for density functional theory (DFT) simulations (in LDA and GGA)**
- Parametrization¹ of $e_{xc}(r_s)$ from ground state quantum Monte Carlo data²
- this made DFT-MD the basis of modern atomic, molecular physics, chemistry, material science

Warm dense matter ($T \sim T_F$):

- ▶ **Thermal DFT³:** minimize free energy $F = E - TS$
- **Requires parametrization of XC free energy of UEG:**

$$f_{xc}(r_s, \theta) = f_{tot}(r_s, \theta) - f_0(r_s, \theta)$$

- ▶ $f_{xc}(r_s, \theta)$ direct input for **Equation of state (EOS) models** of astrophysical objects⁴
- ▶ $f_{xc}(r_s, \theta)$ contains **complete thermodynamic information** of UEG

¹ J.P. Perdew and A. Zunger, PRB **23**, 5048 (1981) ² D.M. Ceperley and B. Alder, PRL **45**, 566 (1980) ³ N.D. Mermin, Phys. Rev **137**, A1441 (1965)

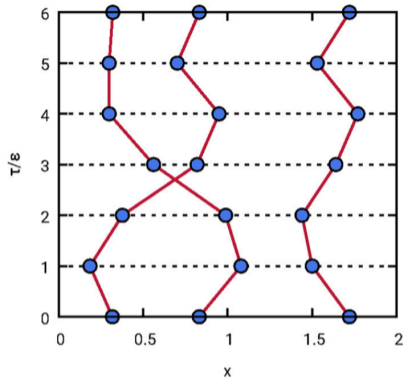
⁴ A.Y. Potekhin and G. Chabrier, A&A **550**, A43 (2013)

Path Integral Monte Carlo (PIMC): Fermions

► Fermionic antisymmetry:

$$Z = \frac{1}{N!} \sum_{\sigma \in S_N} \text{sgn}(\sigma) \int d\mathbf{R} \langle \mathbf{R} | e^{-\beta \hat{H}} | \hat{\pi}_\sigma \mathbf{R} \rangle$$

⇒ We must include **permutation-cycles!**



PIMC configuration of $N = 3$ particles, $W(\mathbf{X}) < 0$

Taken from: T. Dornheim, S. Groth, A. Filinov, and M. Bonitz,
J. Chem. Phys. **151**, 014108 (2019)

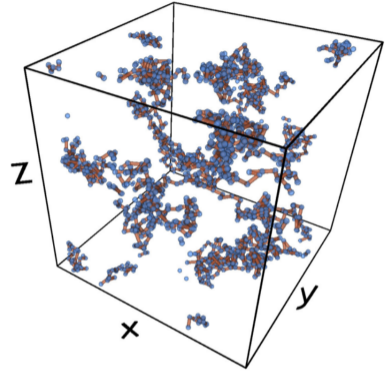
Path Integral Monte Carlo (PIMC): Fermions

- ▶ **Fermionic antisymmetry:**

$$Z = \frac{1}{N!} \sum_{\sigma \in S_N} \text{sgn}(\sigma) \int d\mathbf{R} \langle \mathbf{R} | e^{-\beta \hat{H}} | \hat{\pi}_\sigma \mathbf{R} \rangle$$

⇒ We must include **permutation-cycles!**

- ▶ Randomly generate all possible paths **X** using the **Metropolis algorithm**



Snapshot of PIMC simulation of UEG with $N = 19$, $r_s = 2$, $\theta = 0.5$ (fluctuating probability density)

Taken from: T. Dornheim, S. Groth, A. Filinov, and M. Bonitz, *J. Chem. Phys.* **151**, 014108 (2019)

Path Integral Monte Carlo (PIMC): Fermions

▶ Fermionic antisymmetry:

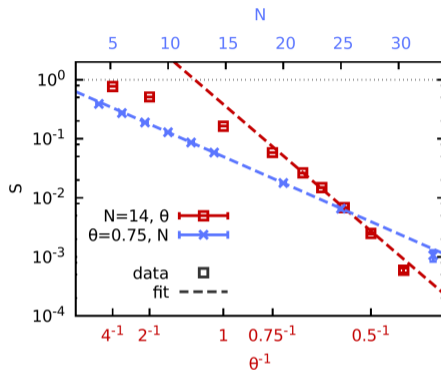
$$Z = \frac{1}{N!} \sum_{\sigma \in S_N} \text{sgn}(\sigma) \int d\mathbf{R} \langle \mathbf{R} | e^{-\beta \hat{H}} | \hat{\pi}_\sigma \mathbf{R} \rangle$$

⇒ We must include **permutation-cycles!**

▶ Randomly generate all possible paths \mathbf{X} using the **Metropolis algorithm**

▶ Sign changes due to particle exchange lead to vanishing signal-to-noise ratio

⇒ Fermion Sign Problem (unsolved!)

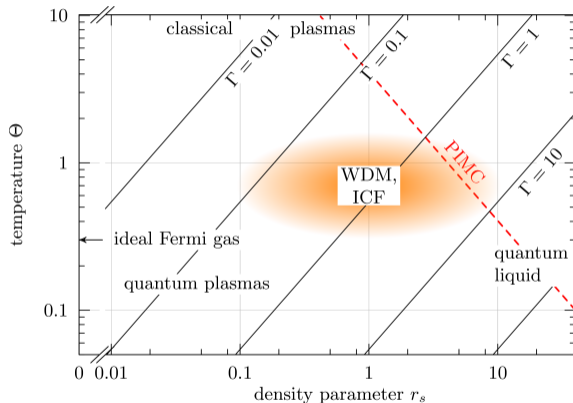


Exponential decrease of the average sign S with system size N and quantum degeneracy θ^{-1}

Taken from: T. Dornheim, *Phys. Rev. E* **100**, 023307 (2019)

Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:



¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

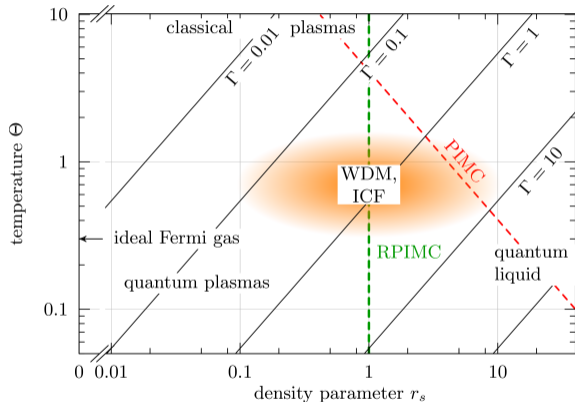
² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:
 - ▶ First results¹ by E. Brown, D. Ceperley *et al.* (2013) based on **fixed node approximation (RPIMC)**
 - ▶ Induces **systematic errors** of unknown magnitude
 - ▶ **RPIMC** limited to $r_s \gtrsim 1$
 - ▶ Fermionic **PIMC**: Filinov *et al.*² limited to $r_s \gtrsim 1$



¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

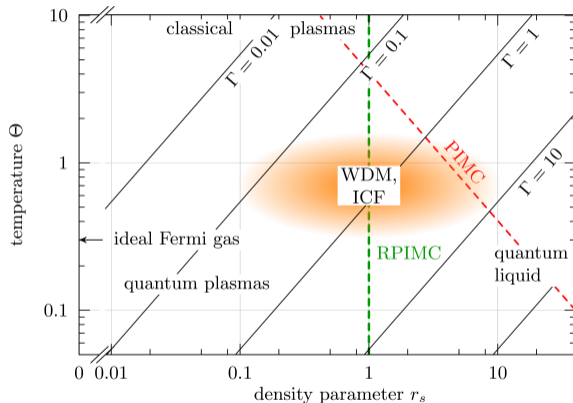
⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:
 - ▶ First results¹ by E. Brown, D. Ceperley *et al.* (2013) based on **fixed node approximation (RPIMC)**
 - ▶ Induces **systematic errors** of unknown magnitude
 - ▶ **RPIMC** limited to $r_s \gtrsim 1$
 - ▶ Fermionic **PIMC**: Filinov *et al.*² limited to $r_s \gtrsim 1$

Our approach:

Avoid fermion sign problem by combining two exact and complementary QMC methods:



¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

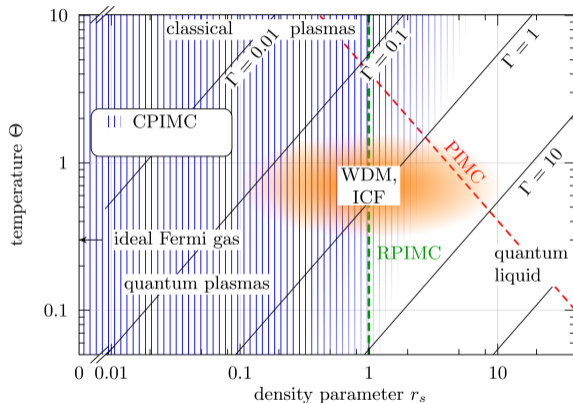
- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:
 - ▶ First results¹ by E. Brown, D. Ceperley *et al.* (2013) based on **fixed node approximation (RPIMC)**
 - ▶ Induces **systematic errors** of unknown magnitude
 - ▶ **RPIMC** limited to $r_s \gtrsim 1$
 - ▶ Fermionic **PIMC**: Filinov *et al.*² limited to $r_s \gtrsim 1$

Our approach:

Avoid fermion sign problem by combining two exact and complementary QMC methods:

1. Configuration PIMC (CPIMC)^{3,4}

→ Excels at high density $r_s \lesssim 1$ and strong degeneracy



¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

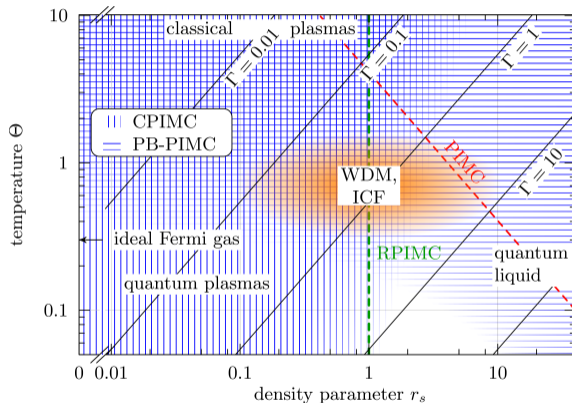
Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:
 - ▶ First results¹ by E. Brown, D. Ceperley *et al.* (2013) based on **fixed node approximation (RPIMC)**
 - ▶ Induces **systematic errors** of unknown magnitude
 - ▶ **RPIMC** limited to $r_s \gtrsim 1$
 - ▶ Fermionic **PIMC**: Filinov *et al.*² limited to $r_s \gtrsim 1$

Our approach:

Avoid fermion sign problem by combining two exact and complementary QMC methods:

1. **Configuration PIMC (CPIMC)**^{3,4}
 - Excels at high density $r_s \lesssim 1$ and strong degeneracy
2. **Permutation blocking PIMC (PB-PIMC)**^{5,6}
 - Extends standard PIMC towards stronger degeneracy



¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

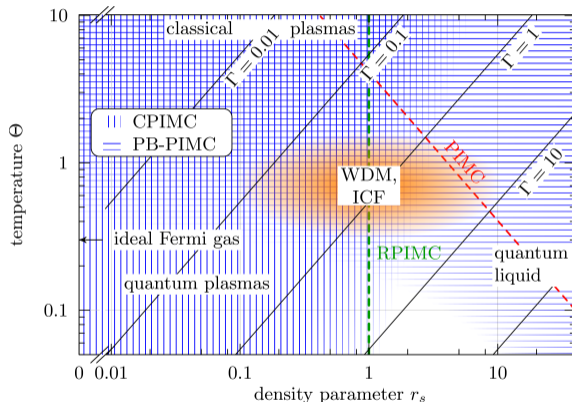
Path integral Monte Carlo (PIMC) simulation of the warm dense UEG

- ▶ Standard PIMC in warm dense regime severely hampered by **fermion sign problem**:
 - ▶ First results¹ by E. Brown, D. Ceperley *et al.* (2013) based on **fixed node approximation (RPIMC)**
 - ▶ Induces **systematic errors** of unknown magnitude
 - ▶ **RPIMC** limited to $r_s \gtrsim 1$
 - ▶ Fermionic **PIMC**: Filinov *et al.*² limited to $r_s \gtrsim 1$

Our approach:

Avoid fermion sign problem by combining two exact and complementary QMC methods:

1. **Configuration PIMC (CPIMC)**^{3,4}
 - Excels at high density $r_s \lesssim 1$ and strong degeneracy
2. **Permutation blocking PIMC (PB-PIMC)**^{5,6}
 - Extends standard PIMC towards stronger degeneracy



Ab initio simulations over broad range of parameters possible

¹ E.W. Brown *et al.*, PRL **110**, 146405 (2013)

³ T. Schoof *et al.*, Phys. Rev. Lett **115**, 130402 (2015)

⁴ T. Schoof *et al.*, Contrib. Plasma Phys. **51**, 687 (2011)

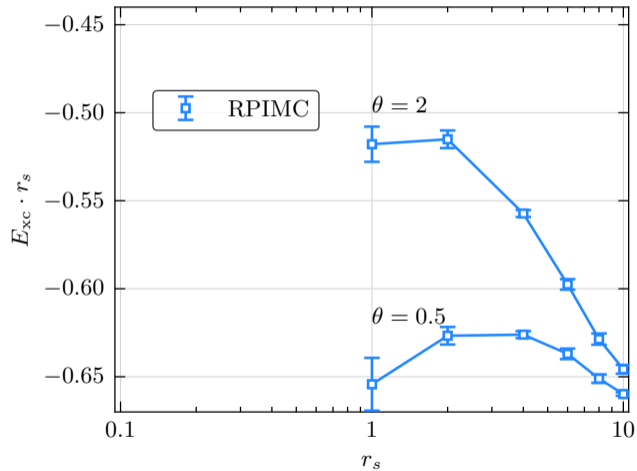
² V. Filinov *et al.*, Phys. Rev. E **91**, 033108 (2015)

⁵ T. Dornheim *et al.*, New J. Phys. **17**, 073017 (2015)

⁶ T. Dornheim *et al.*, J. Chem. Phys. **143**, 204101 (2015)

1. Exact exchange-correlation energy $E_{xc} = E - E_0$ (E_0 : ideal energy)
($N = 33$ spin-polarized electrons, $\theta \geq 0.5, \forall r_s$)

► **RPIMC** limited to $r_s \geq 1$



¹S. Groth *et al.*, Phys. Rev. B **93**, 085102 (2016)

²T. Dornheim *et al.*, Phys. Rev. B **93**, 205134 (2016)

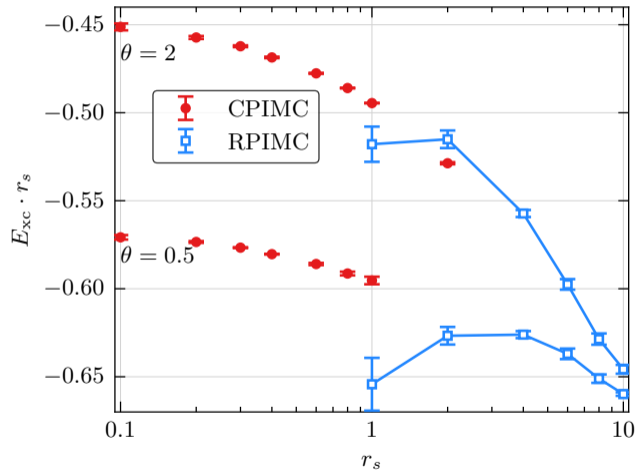
³F.D. Malone *et al.*, Phys. Rev. Lett. **117**, 115701 (2016)

⁴T. Dornheim *et al.*, Phys. Rev. Lett. (2016)

⁵S. Groth *et al.*, Phys. Rev. Lett. (2017)

1. Exact exchange-correlation energy $E_{xc} = E - E_0$ (E_0 : ideal energy)
($N = 33$ spin-polarized electrons, $\theta \geq 0.5, \forall r_s$)

- ▶ **RPIMC** limited to $r_s \geq 1$
- ▶ **CPIMC** excels at high density



¹S. Groth *et al.*, Phys. Rev. B **93**, 085102 (2016)

²T. Dornheim *et al.*, Phys. Rev. B **93**, 205134 (2016)

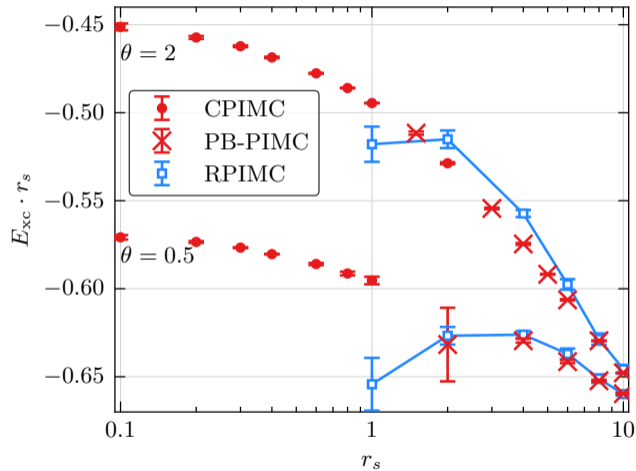
³F.D. Malone *et al.*, Phys. Rev. Lett. **117**, 115701 (2016)

⁴T. Dornheim *et al.*, Phys. Rev. Lett. (2016)

⁵S. Groth *et al.*, Phys. Rev. Lett. (2017)

1. Exact exchange-correlation energy $E_{xc} = E - E_0$ (E_0 : ideal energy)
($N = 33$ spin-polarized electrons, $\theta \geq 0.5, \forall r_s$)

- ▶ **RPIMC** limited to $r_s \geq 1$
- ▶ **CPIMC** excels at high density
- ▶ **PB-PIMC** applicable at $\theta \gtrsim 0.5$



¹S. Groth *et al.*, Phys. Rev. B **93**, 085102 (2016)

²T. Dornheim *et al.*, Phys. Rev. B **93**, 205134 (2016)

³F.D. Malone *et al.*, Phys. Rev. Lett. **117**, 115701 (2016)

⁴T. Dornheim *et al.*, Phys. Rev. Lett. (2016)

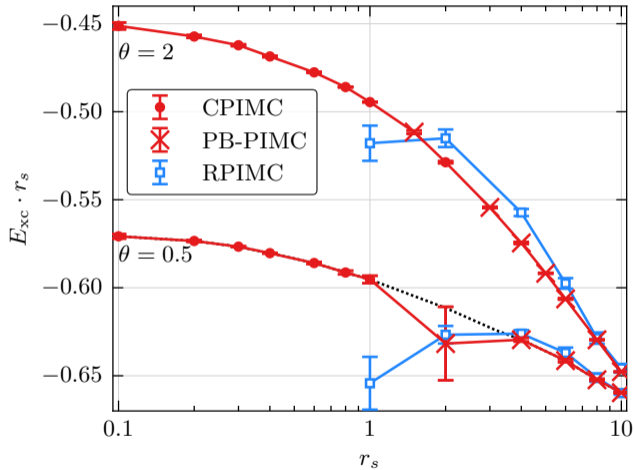
⁵S. Groth *et al.*, Phys. Rev. Lett. (2017)

1. Exact exchange-correlation energy $E_{xc} = E - E_0$ (E_0 : ideal energy) ($N = 33$ spin-polarized electrons, $\theta \geq 0.5, \forall r_s$)

- ▶ **RPIMC** limited to $r_s \geq 1$
- ▶ **CPIMC** excels at high density
- ▶ **PB-PIMC** applicable at $\theta \gtrsim 0.5$

Combination¹ yields exact results over entire density range down to $\theta \sim 0.5$

- ▶ Also applies to the **unpolarized UEG²**
- ▶ confirmed by independent **DMQMC** simulations³
- ▶ Extended to TD Limit⁴ and to the ground state⁵
- ▶ Analytical parametrization of $f_{xc}(r_s, \theta, \xi)$, "GDSMFB", with error below 0.3%, Integrated in standard DFT libraries⁵



¹S. Groth *et al.*, Phys. Rev. B **93**, 085102 (2016)

²T. Dornheim *et al.*, Phys. Rev. B **93**, 205134 (2016)

³F.D. Malone *et al.*, Phys. Rev. Lett. **117**, 115701 (2016)

⁴T. Dornheim *et al.*, Phys. Rev. Lett. (2016)

⁵S. Groth *et al.*, Phys. Rev. Lett. (2017)

Recognition for our work...

APS John Dawson Award 2021

Kiel group:

Tim Schoof (PhD 2016), **Simon Groth** (PhD 2018): CPIMC, finite size corrections etc.

Tobias Dornheim (PhD 2018): PB-PIMC now at CASUS Görlitz, **Extension to static and dynamic response, transport, DFT, machine learning, nonlinear density response etc.**

UK and US collaborators:

F. Malone, M. Foulkes and T. Sjostrom



63rd Annual Meeting of the
APS Division of Plasma Physics



2021 PRIZES & AWARDS

John Dawson Award for Excellence in Plasma Physics Research

For developing Monte Carlo methods that overcome the fermion sign problem, leading to the first ab initio data for an electron gas under warm dense matter conditions.

	William Foulkes Imperial College London		Simon Groth Christian-Albrechts University in Kiel
	Travis Sjostrom Los Alamos National Laboratory		Tobias Dornheim Center for Advanced Systems Understanding (CASUS)
	Fionn Malone QC Ware		Michael Bonitz Kiel University
	Tim Schoof DESY		

Ab Initio PIMC approach to equilibrium response and transport properties

Quantities accessible in PIMC:

all thermodynamic functions from $F(r_s, \theta)$; structural properties: $g(r)$, $S(q)$

fluctuations in response to excitation: $\delta\hat{H}(\mathbf{q}) \rightarrow \delta\rho(\mathbf{q})$

correlation functions: e.g. $\langle \delta\rho(\mathbf{q}_1, \tau_1)\rho(\mathbf{q}_2, \tau_2) \rangle$ yield transport properties

Susceptibilities from linear response theory (LRT):

$\delta\rho(\mathbf{q}) = \chi(\mathbf{q})\delta H(\mathbf{q})$, χ : static density response \rightarrow comparison for PIMC to LRT/experiment

Correlation and exchange effects: encoded in “local field correction” $G(\mathbf{q}, \omega)$

straightforward connection to transport¹, optics etc.: $\chi(\mathbf{q}, \omega)$, $S(\mathbf{q}, \omega)^2$, $\epsilon(\mathbf{q}, \omega)$, $\sigma(\mathbf{q}, \omega)$, plasmon dispersion³

PIMC: susceptibilities beyond validity limits of LRT⁴

Ab initio spectral properties, momentum distribution $n(p)$

¹Hamann et al., Phys. Rev. B (2020)

²Dornheim et al., Phys. Rev. Lett. 2018

³Hamann et al., Contrib. Plasma Phys. 2020

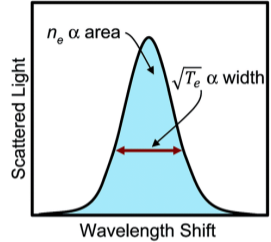
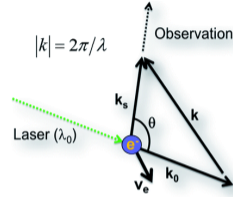
⁴Dornheim et al., Phys. Rev. Lett. (2020)

Ab initio dynamic (ω -dependent) results for the warm dense UEG

- ▶ **Key quantity:** dynamic structure factor

$$S(\mathbf{q}, \omega) := \frac{1}{2\pi} \int_{-\infty}^{\infty} dt \underbrace{\langle \hat{n}_{\mathbf{q}}(t) \hat{n}_{-\mathbf{q}}(0) \rangle}_{:=F(\mathbf{q}, t)} e^{i\omega t}$$

→ directly measured in **scattering experiments**



X-ray Thomson scattering experiments at free electron laser facilities (e.g. FLASH, X-FEL, LCLS)

yields the most accurate information on plasma density, ionic charge state, and temperature

data analysis requires model input

Ab initio dynamic (ω -dependent) results for the warm dense UEG

- ▶ **Key quantity:** dynamic structure factor

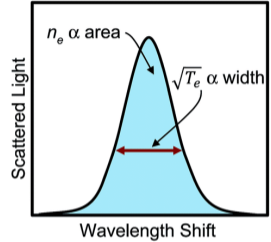
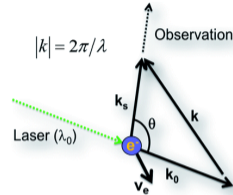
$$S(\mathbf{q}, \omega) := \frac{1}{2\pi} \int_{-\infty}^{\infty} dt \underbrace{\langle \hat{n}_{\mathbf{q}}(t) \hat{n}_{-\mathbf{q}}(0) \rangle}_{:=F(\mathbf{q}, t)} e^{i\omega t}$$

→ directly measured in **scattering experiments**

- ▶ **Chihara decomposition** applies for non-collective scattering:

$$S(\mathbf{q}, \omega) = S_{b-b}(\mathbf{q}, \omega) + S_{b-f}(\mathbf{q}, \omega) + S_{f-f}(\mathbf{q}, \omega)$$

$$\rightarrow S_{f-f}(\mathbf{q}, \omega) \sim S^{\text{UEG}}(\mathbf{q}, \omega)$$



X-ray Thomson scattering experiments at free electron laser facilities (e.g. FLASH, X-FEL, LCLS)

yields the most accurate information on plasma density, ionic charge state, and temperature

data analysis requires model input

Ab initio dynamic (ω -dependent) results for the warm dense UEG

- ▶ **Key quantity:** dynamic structure factor

$$S(\mathbf{q}, \omega) := \frac{1}{2\pi} \int_{-\infty}^{\infty} dt \underbrace{\langle \hat{n}_{\mathbf{q}}(t) \hat{n}_{-\mathbf{q}}(0) \rangle}_{:=F(\mathbf{q}, t)} e^{i\omega t}$$

→ directly measured in **scattering experiments**

- ▶ **Chihara decomposition** applies for non-collective scattering:

$$S(\mathbf{q}, \omega) = S_{b-b}(\mathbf{q}, \omega) + S_{b-f}(\mathbf{q}, \omega) + S_{f-f}(\mathbf{q}, \omega)$$

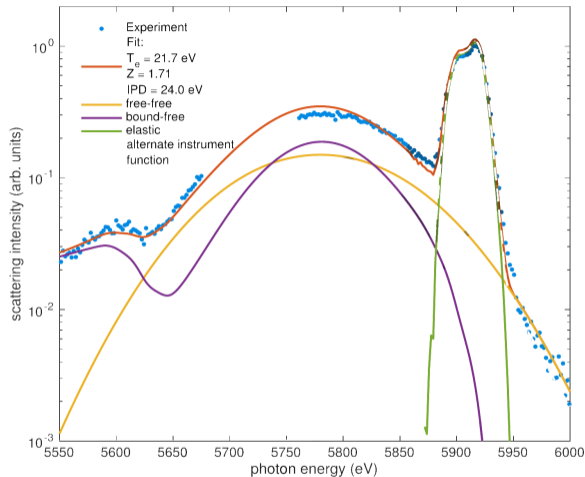
$$\rightarrow S_{f-f}(\mathbf{q}, \omega) \sim S^{\text{UEG}}(\mathbf{q}, \omega)$$

- ▶ **Practical example:** Fit model for $S(\mathbf{q}, \omega; T_e)$ to spectrum to determine electron temperature T_e

- ▶ **Problem:**

$F(\mathbf{q}, t)$ requires **real time-dependent simulations**

→ with PIMC have to use analytic continuation, reconstruct $F(q, it)$ and 4 frequency moments, but: insufficient information



Scattering spectrum of isochorically heated graphite at LCLS.
From D. Kraus *et al.*, *Plasma Phys. Control. Fusion* (2019)

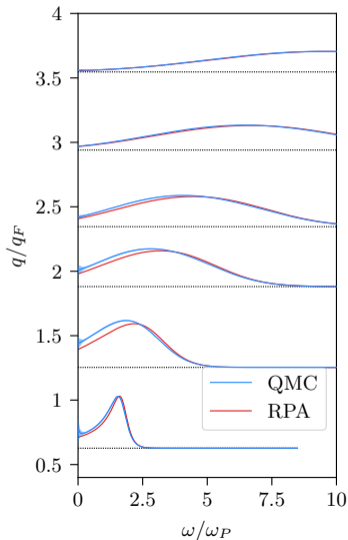
Correlation effects, Landau and collisional damping in $S(q, \omega)$: $\theta = 1$, $r_s = 2$

T. Dornheim, S. Groth, J. Vorberger, and M. Bonitz, *Phys. Rev. Lett.* **121**, 255001 (2018)

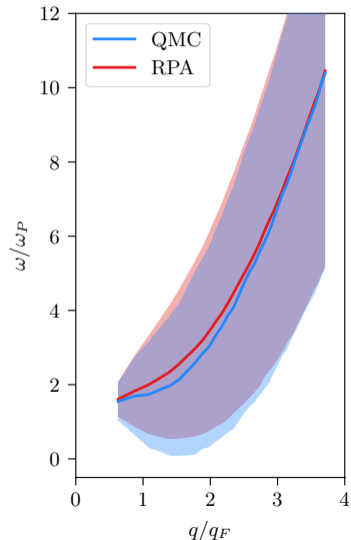
Slight **correlation induced redshift**
of peak for intermediate q (at small r_s)

^aExplanation in Dornheim et al., arXiv:2203.12288

Dynamic structure factor of the UEG:



Peak position and FWHM:



Correlation effects, Landau and collisional damping in $S(\mathbf{q}, \omega)$: $\theta = 1$, $r_s = 10$

T. Dornheim, S. Groth, J. Vorberger, and M. Bonitz, *Phys. Rev. Lett.* **121**, 255001 (2018)

Slight **correlation induced redshift**
of peak for intermediate q (at small r_s)

Pronounced redshift and broadening
with increasing r_s

Negative dispersion of peak^a for
large r_s around $q = 2q_F$
predicted for dense hydrogen

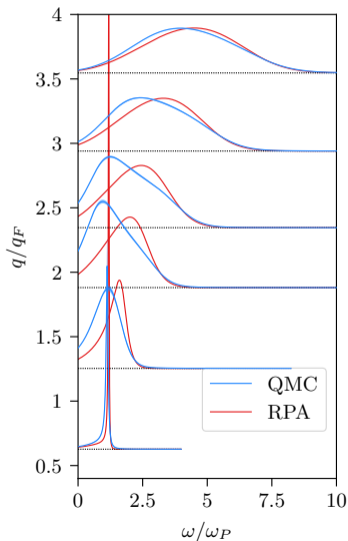
Closely related to plasmons

Requires dielectric function $\epsilon(\mathbf{q}, \omega)$

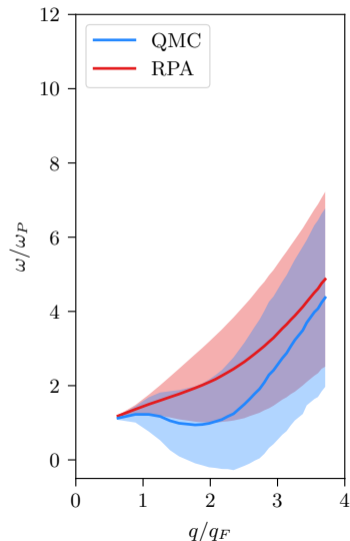
$$S(\mathbf{q}, \omega) = -\frac{\text{Im} \epsilon^{-1}(\mathbf{q}, \omega)}{\pi n \tilde{v}(q) (1 - e^{-\beta \omega})}$$

^aExplanation in Dornheim et al., arXiv:2203.12288

Dynamic structure factor of the UEG:



Peak position and FWHM:

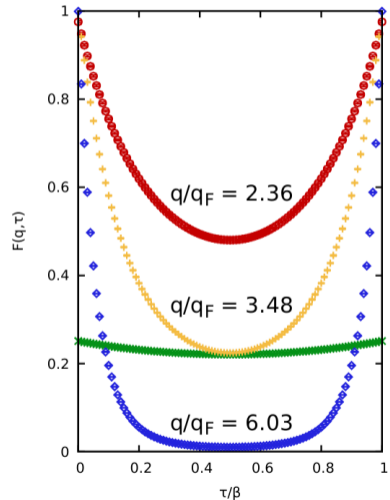


The Static Local Field Correction: *Ab initio* PIMC Simulations

- ▶ PIMC gives direct access to imaginary-time density–density correlation function:

$$F(\mathbf{q}, \tau) = \frac{1}{N} \langle \rho(\mathbf{q}, \tau) \rho(-\mathbf{q}, 0) \rangle$$

S. Groth, T. Dornheim, and J. Vorberger,
Phys. Rev. B **99**, 235122 (2019)



The Static Local Field Correction: *Ab initio* PIMC Simulations

- ▶ PIMC gives direct access to imaginary-time density–density correlation function:

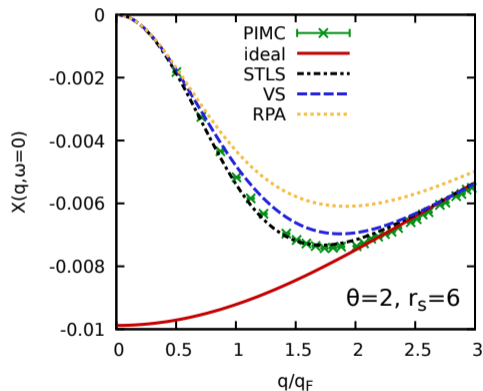
$$F(\mathbf{q}, \tau) = \frac{1}{N} \langle \rho(\mathbf{q}, \tau) \rho(-\mathbf{q}, 0) \rangle$$

- ▶ $F(\mathbf{q}, \tau)$ is directly connected to **static** density response $\chi(\mathbf{q}) = \chi(\mathbf{q}, \omega = 0)$:

$$\chi(\mathbf{q}) = -n \int_0^\beta d\tau F(\mathbf{q}, \tau)$$

→ full \mathbf{q} -dependence from a single simulation of the unperturbed UEG

S. Groth, T. Dornheim, and J. Vorberger,
Phys. Rev. B **99**, 235122 (2019)



The Static Local Field Correction: *Ab initio* PIMC Simulations

- ▶ PIMC gives direct access to imaginary-time density–density correlation function:

$$F(\mathbf{q}, \tau) = \frac{1}{N} \langle \rho(\mathbf{q}, \tau) \rho(-\mathbf{q}, 0) \rangle$$

- ▶ $F(\mathbf{q}, \tau)$ is directly connected to **static** density response $\chi(\mathbf{q}) = \chi(\mathbf{q}, \omega = 0)$:

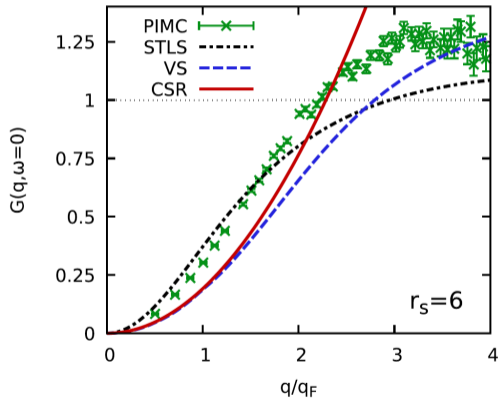
$$\chi(\mathbf{q}) = -n \int_0^\beta d\tau F(\mathbf{q}, \tau)$$

→ full \mathbf{q} -dependence from a single simulation of the unperturbed UEG

- ▶ $G(q)$ can be obtained as the deviation from $\chi_0(q)$:

$$G(\mathbf{q}) = 1 - \frac{1}{v_q} \left(\frac{1}{\chi_0(\mathbf{q}, 0)} - \frac{1}{\chi(\mathbf{q})} \right) .$$

S. Groth, T. Dornheim, and J. Vorberger,
Phys. Rev. B **99**, 235122 (2019)

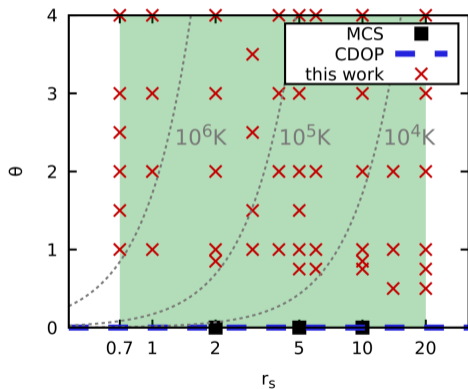


The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

- ▶ QMC data available at discrete grid $(q; \theta, r_s)$

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)

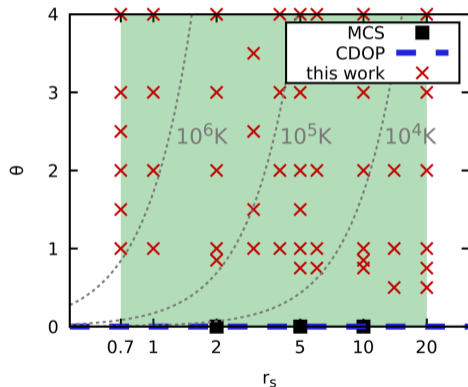


The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

- ▶ QMC data available at discrete grid ($q; \theta, r_s$)
- ▶ **Problem:** Applications (DFT, hydrodynamics, ...) typically require continuous representation

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)

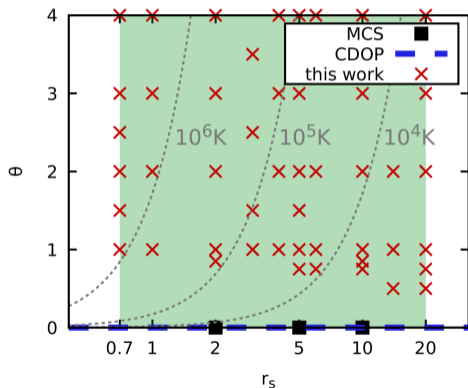


The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

- ▶ QMC data available at discrete grid $(q; \theta, r_s)$
- ▶ **Problem:** Applications (DFT, hydrodynamics, ...) typically require continuous representation
- ▶ Complicated, non-trivial behavior of $G(q; r_s, \theta)$, only few analytical limits are known

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)

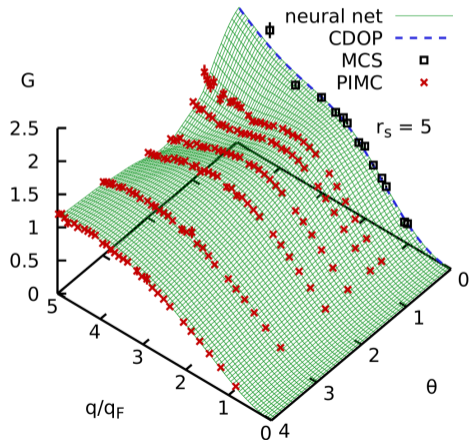


The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

- ▶ QMC data available at discrete grid $(q; \theta, r_s)$
- ▶ **Problem:** Applications (DFT, hydrodynamics, ...) typically require continuous representation
- ▶ Complicated, non-trivial behavior of $G(q; r_s, \theta)$, only few analytical limits are known
- ▶ **Solution:** Neural net as flexible function approximator

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)

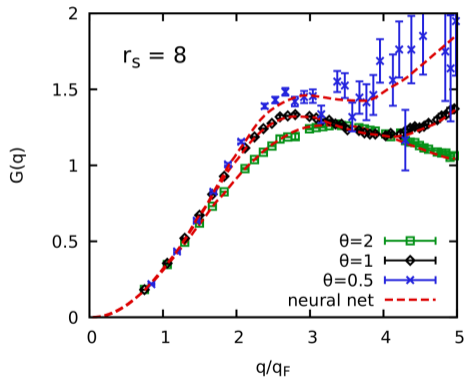


The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

- ▶ QMC data available at discrete grid ($q; \theta, r_s$)
- ▶ **Problem:** Applications (DFT, hydrodynamics, ...) typically require continuous representation
- ▶ Complicated, non-trivial behavior of $G(q; r_s, \theta)$, only few analytical limits are known
- ▶ **Solution:** Neural net as flexible function approximator
- ▶ **Successful validation against independent data!**
- ▶ **Basis for transport quantities, screened ion potential**
Benchmarks for models and simulations

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)



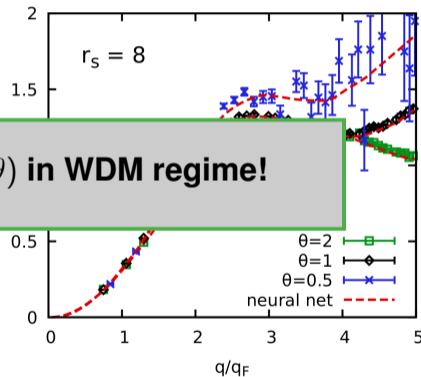
The Static Local Field Correction: Neural-net representation

Extensive set of new PIMC data

Source: T. Dornheim *et al.*,
J. Chem. Phys. (2019)

- ▶ QMC data available at discrete grid $(q; \theta, r_s)$
- ▶ **Problem:** Applications (DFT, hydrodynamics, ...) typically require
- ▶ Computational analytical
- ▶ **Solution:** Neural net as flexible function approximator
- ▶ **Successful validation against independent data!**
- ▶ **Basis for transport quantities, screened ion potential**
Benchmarks for models and simulations

Complete *ab initio* data for $G(q; r_s, \theta)$ in WDM regime!



The momentum distribution function (thermodynamic equilibrium)

▶ Classical plasma

- ▶ ideal plasma: Maxwell distribution
- ▶ interacting plasma: Maxwell distribution
 - ⇒ **exponential decay** for large momenta

▶ Quantum plasma

- ▶ ideal plasma: Fermi/Bose function
 - ⇒ **exponential decay** for large momenta

The momentum distribution function (thermodynamic equilibrium)

▶ Classical plasma

- ▶ ideal plasma: Maxwell distribution
 - ▶ interacting plasma: Maxwell distribution
- ⇒ exponential decay for large momenta

▶ Quantum plasma

- ▶ ideal plasma: Fermi/Bose function
- ⇒ exponential decay for large momenta

▶ What about nonideal Quantum plasmas?

- ▶ slower non-exponential decay, $\sim p^{-8}$, predicted⁵
 - ▶ relevant for threshold processes: dramatic increase of reaction rates, fusion rates could be possible
 - ▶ important for electrons under warm dense matter (WDM) conditions or ions in dense stars
- ▶ First *ab initio* Quantum Monte Carlo results for WDM available:
K. Hunger *et al.*, Phys. Rev. E **103**, 053204 (2021), arXiv:2101.00842
T. Dornheim *et al.*, Phys. Rev. B **103**, 205142 (2021)

⁵Daniel, Vosko (1960); Galitskii, Migdal (1967)

Ab initio CPIMC-results for the momentum distribution⁶

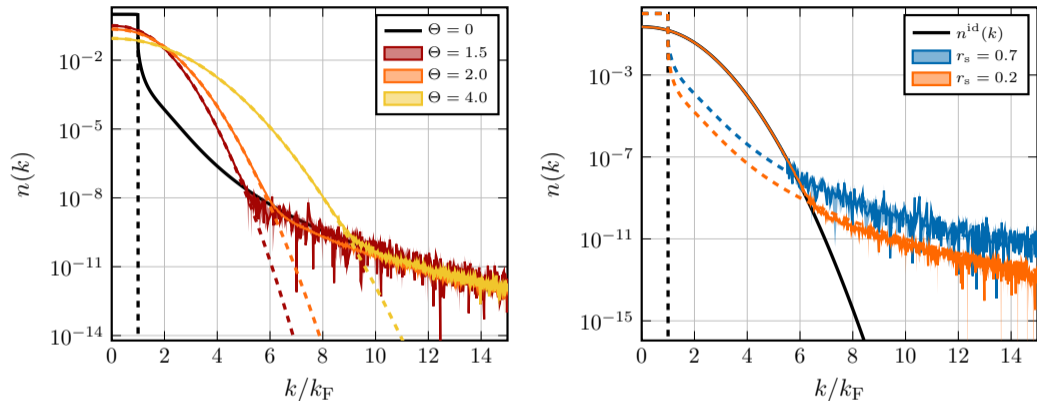


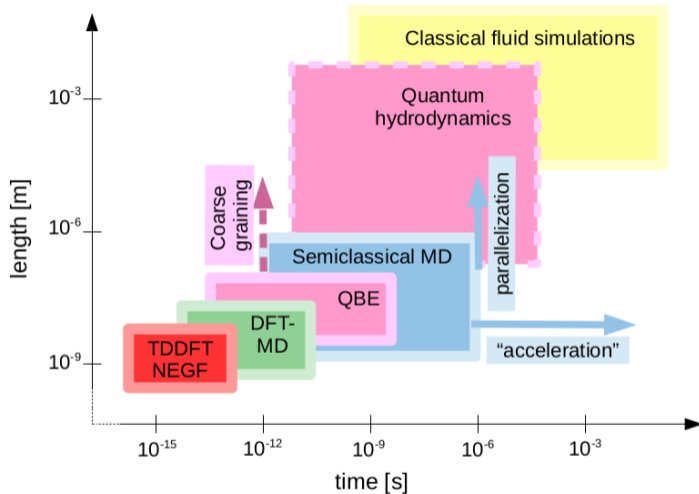
Figure: **Left:** Temperature dependence at $r_s = 0.5$. Full lines: CPIMC, dashed: Fermi function n^{id} .

Right: Density dependence at $\Theta = 2$. Full lines: CPIMC, dashed: ground state, black: n^{id} .

Unprecedented accuracy (11 digits, large k -range), confirm ρ^{-8} asymptotic, accurate n - and T -dependence
Crucial for reaction rates of threshold processes

⁶K. Hunger *et al.*, Phys. Rev. E **103**, 053204 (2021); T. Dornheim *et al.*, Phys. Rev. B **103**, 205142 (2021)
ground state results: Gori-Giorgi *et al.* (2001)

Nonequilibrium simulations of warm dense matter



- QBE: Quantum Boltzmann equation
- NEGF: Nonequilibrium Green Functions
- TDDFT: time-dependent DFT
- additional methods for classical plasmas: PIC/MCC, Boltzmann equation

Figure: Approximate range of applicability of different methods; from Bonitz *et al.*, Phys. Plasmas **27** (4), 042710 (2020)

Quantum kinetic theory simulations⁷

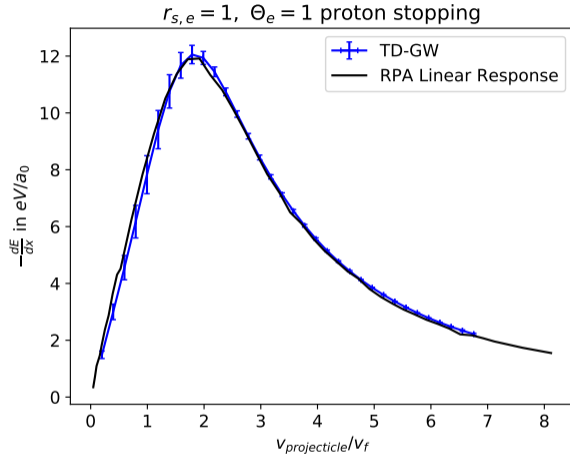


Figure: Stopping power of protons in a dense electron plasma. Time-dependent solution of quantum kinetic equation with the generalized Kadanoff-Baym ansatz, compared to linear response calculations involving *ab initio* QMC-input (C. Makait, Z. Moldabekov, and M. Bonitz, to be published)

- NEGF are the most accurate approach to nonequilibrium quantum plasmas, but very CPU time costly
- recently we achieved a dramatic acceleration [Schlünzen et al., PRL 2020]
 - ⇒ NEGF results will provide benchmarks for real-time TDDFT and deliver improved xc-functionals
 - ⇒ TDDFT results will provide benchmarks for QHD and improved Bohm potential V_B
 - ⇒ **Basis for accurate time-dependent quantum simulations over large time and length scales**

⁷M. Bonitz, *Quantum Kinetic Theory*, 2nd ed., Springer 2016

Quantum hydrodynamics for shock propagation

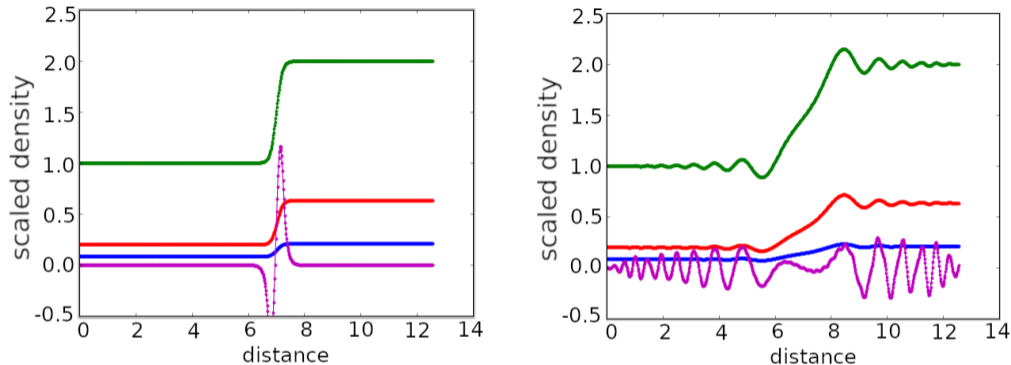


Figure: Influence of the Bohm potential (pink) on the density profile (green) of a running shock. Dense plasma of $r_s = 2$ and $\Theta \approx 0$. Left: initial state, right: $t = 0.62 a_B / c_s$. Red: Thomas-Fermi pressure, blue: exchange pressure. From: Graziani *et al.*, Contrib. Plasma Phys. (2022), arXiv:2109.09081

The Bohm potential V_B causes a shear force (stretching) of the shock front. Accurate form of V_B is crucial.⁸

⁸Moldabekov *et al.*, Phys. Plasmas **25**, 031903 (2018); Bonitz *et al.*, Phys. Plasmas **26**, 090601 (2019)

Warm dense matter and quantum plasmas – Summary and outlook⁹

► Crucial for astrophysics and laboratory experiments:

- complex state of matter, between condensed matter and plasmas
- New facilities: accurate experimental results (e.g. X-ray Thomson scattering)

► Accurate simulation results now available:

- *Ab initio* QMC results for the electron component, avoid sign problem^a.
- Benchmarks, input for analytical models and for DFT and QHD
- *Ab initio* results for transport and dielectric properties, momentum distrib.^b

► Outlook: accurate multiscale nonequilibrium simulations^c:

- combination of Green functions, TDDFT, and QHD^d
- further improvement of CPIMC, extension to two-component plasmas

^aDornheim *et al.*, Phys. Reports (2018)

^bDornheim *et al.*, PRL (2018); Hamann *et al.*, PRB (2020); Hunger *et al.*, PRE (2021)

^cBonitz *et al.*, Phys. Plasmas (2020)

^dBonitz *et al.*, Phys. Plasmas (2019); Moldabekov *et al.*, SciPost Phys. (2022) arXiv:2103.08523

