

# ATOMISTIC SIMULATIONS ON SUPERCOMPUTERS USING OPEN SOURCE CODES

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July 19, 2012

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  - **Molecular Dynamics (MD)**
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- 3. Challenges for atomistic simulation codes:**
  - **Interaction models**
  - **Parallel scaling**
  - **Using GPUs**
  - **Atomistic simulations on the Grid**

# First papers on MD simulations

## Phase Transition for a Hard Sphere System

B. J. ALDER AND T. E. WAINWRIGHT

*University of California Radiation Laboratory, Livermore, California*

(Received August 12, 1957)

A 32-particle system in a cube and initially in a face-centered cubic lattice proceeded at about 300 collisions an hour on the UNIVAC. For comparison a 96-particle system in a rectangular box and initially in a hexagonal arrangement has been calculated, however only at high



A CALCULATION has been made of the relaxation times for a hard sphere system. The number of significant figures in the classical equations of motion is determined by means of details as the system is having square described.<sup>1,2</sup> The equilibrium state of hard spheres is Monte Carlo

The calculation is for a rectangular box. Initially, the velocities of the particles are chosen from the Maxwell-Boltzmann distribution. The pressure is calculated from the means of the velocities of the momenta. The pressure has a distribution function within the

pressures can be long runs were accordingly the results, an hour is of 108, 256, the handled; in respectively, can particles are statistics.

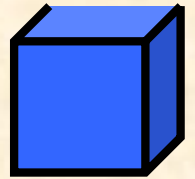
One of the advantages of the Monte Carlo method is for the agreement was results. The time of close ended Monte Carlo these three systems the pressure is an interesting mechanical mechanics

The figure shows two overlapping distributions which exist in two phases. As the system is to jump suddenly of the posi-

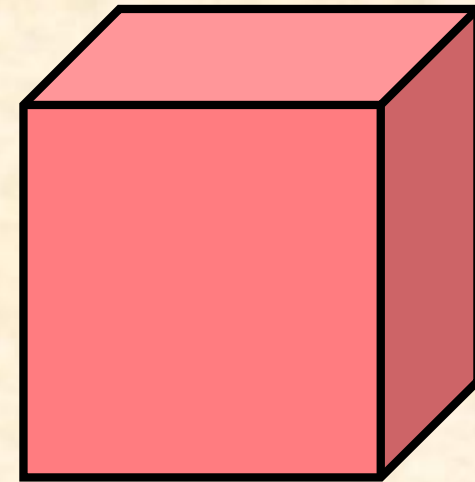
# The record numbers of particles taken for MD simulations in different years



1964	1.000	Rahman
1984	200.000	Abraham
1990	1.000.000	Swope, Anderson
1994	100.000.000	Beazley, Lomdahl
1997	1.213.857.792	Stadler
1997	1.399.440.000	Müller
1999	5.180.116.000	Roth
2000	8.500.000.000	Vashishta
2003	19.000.416.964	Kadav, Germann, Lomdahl
2005	160.000.000.000	Kadav, Germann, Lomdahl
2006	320.000.000.000	Kadav, Germann, Lomdahl
2008	1.000.000.000.000	Kadav, Germann



4 nm



4  $\mu$ m



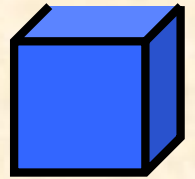
# Years, Flop/s and the numbers of cores

Mflops	1964 г.	CDC 6600	10 MHz	1 CPUs
Gflops	1985 г.	Cray 2	125 MHz	8 CPUs
Tflops	1997 г.	ASCI Red	200 MHz	9152 CPUs
Pflops	2008 г.	Roadrunner	3,2 GHz	122400 Cores
Eflops	≈ 2018 г.			$10^8 - 10^9$

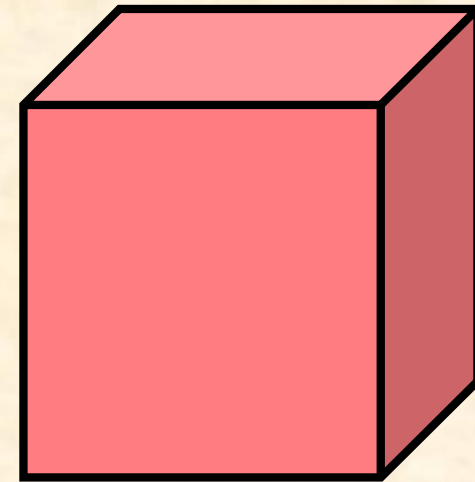
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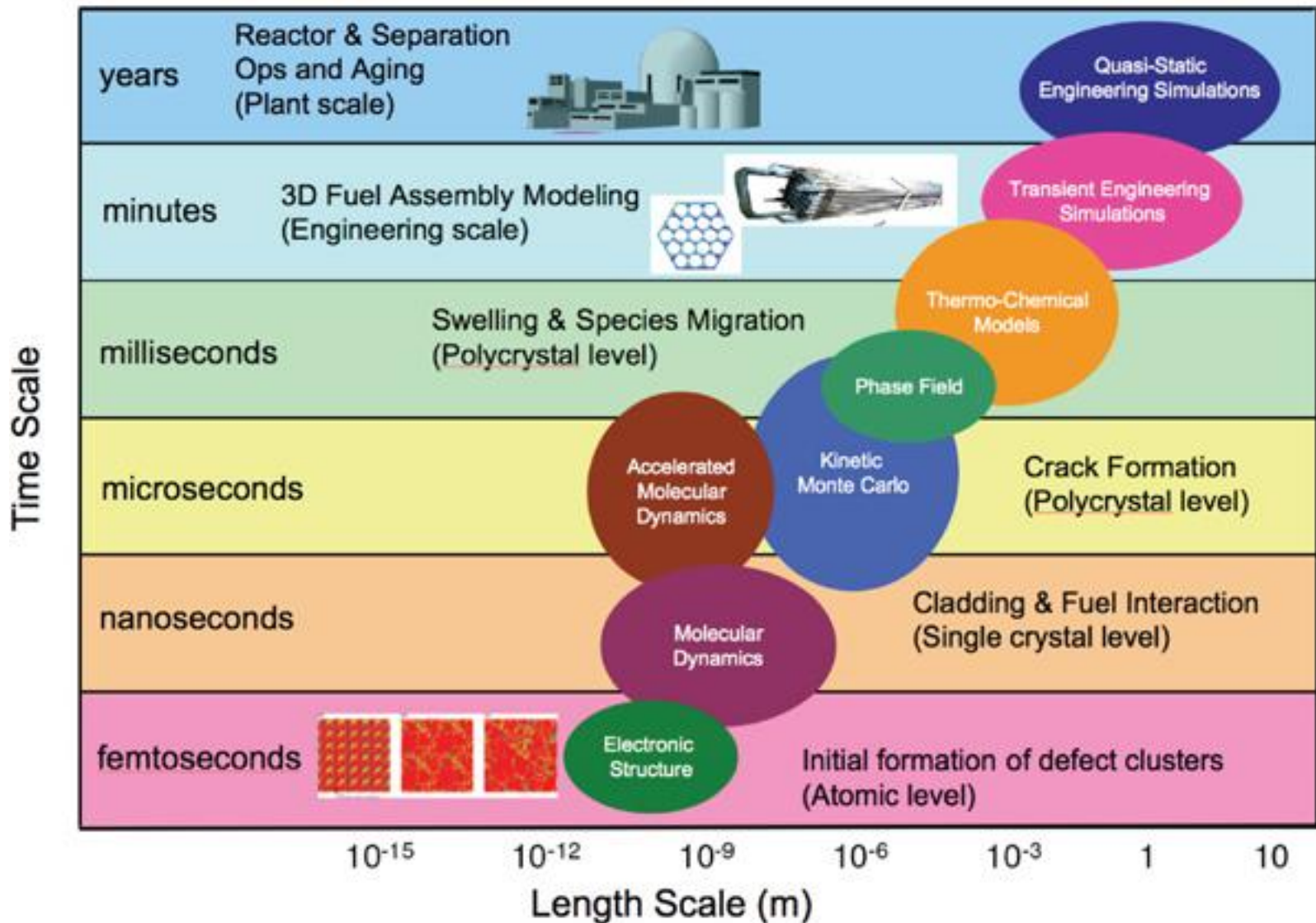
4 nm



4  $\mu$ m



# Multiscale approach in material sciences



# Choice of the simulation code

## Open source

- Free of charge 😊
- Allows modifications
- Implements cutting edge technologies
- Tested by many users over the internet
- Supported by a community of developers

## Proprietary

- Reliable
- Easier to install and configure
- Professional support
- Usually has better support for different platforms



*Creating new code  
on the basis of an  
open source project*





# Key features of atomistic simulation codes

## ➤ **Basic simulation algorithms**

*MD, MC, energy minimization, thermostats, boundary conditions, neighbor lists, optimized electrostatics*

## ➤ **Particle interaction models**

*Force fields for pair and many-body potentials, customization*

## ➤ **Trajectory analysis tools**

*Binary trajectory output, plausible modules for calculation of thermodynamics, correlation functions, etc. including averaging*

## ➤ **Parameter input and variation**

*Parameter input languages, batch runs, workflows*

## ➤ **Parallel execution**

*Parallel efficiency on modern supercomputing clusters*

## ➤ **Optimization for a special hardware, GPU**

## ➤ **Visualization**

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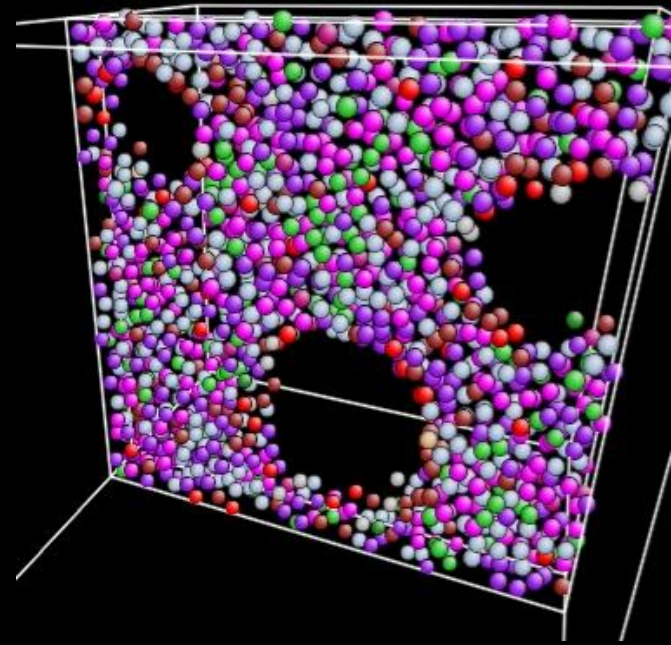
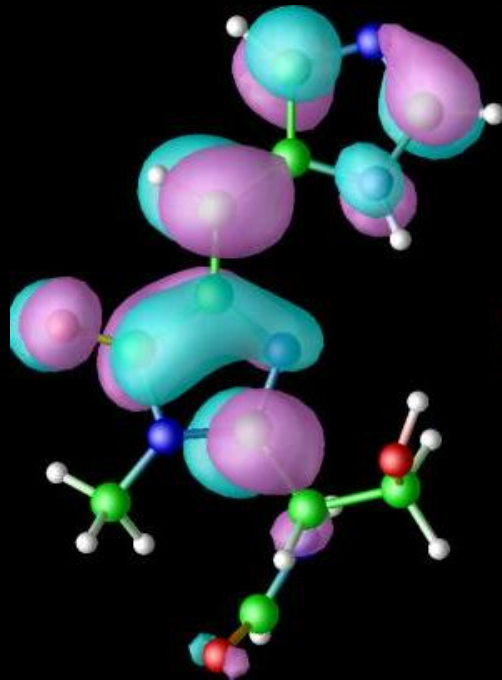
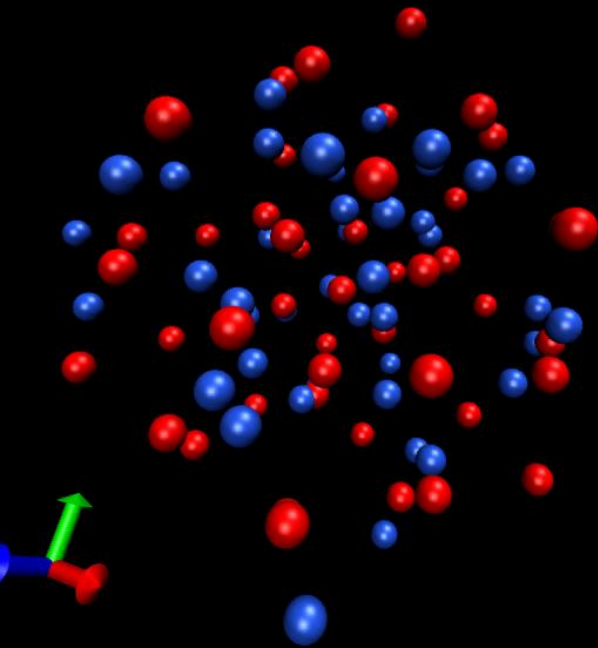
## ➤ **Optimization for a special hardware, GPU**

## ➤ **Visualization**

# Open source packages for atomistic simulations

Package name	Language	GPU	Parallel	Min	MD	MC	Comment
<b>Adun</b>	C			+	+		User specified force field (FFML), QM/MM calculations with Empirical Valence Bond (EVB)
<b>DL_POLY*</b>	Fortran, C++, Java				+		General purpose MD, HDF5 output, Java GUI
<b>GROMACS</b>	C	+	MPI		+		High performance MD, designed for biological systems and polymers
<b>HALMD</b>	C++	++			+		High-precision MD for the large-scale simulation of simple and complex liquids, HDF5 output
<b>HOOMD-blue</b>	C++, Python	++		+	+		General-purpose MD highly optimized for GPUs
<b>LAMMPS</b>	C++	+	MPI	+	+	+	High parallel scalability, wide range of potentials and analysis tools
<b>MDynaMix</b>	Fortran		MPI		+		Parallel MD for AMBER force field
<b>MOIL</b>	Fortran, Tcl		MPI	+	+		Basic algorithms and force fields, Replica exchange, coarse-grained models, Tcl GUI
<b>NAMD/VMD</b>	C++	+	MPI				High parallel scalability, designed for biomolecular, visualization (VMD)
<b>RedMD</b>	C/C++	-		+	+	+	Coarse-grained models of proteins and nucleic acids
<b>TINKER</b>	Fortran		OpenMP	+	+	+	Simple MD, QM/MM, molecular design
<b>XMD</b>	C		pthreads	+	+	+	MD for metals and ceramics

# SIMULATION ALGORITHMS



# Molecular Dynamics: Trajectory Calculation

Set initial coordinates and positions

$$\vec{r}_i(t_0) = \vec{r}_{i0}, \quad \vec{v}_i(t_0) = \vec{v}_{i0}, \quad i = 1, \dots, N$$

Calculate forces between particles

$$\vec{F}_i = -\frac{\partial U(\vec{r}_1, \dots, \vec{r}_N)}{\partial \vec{r}_i}$$

Perform MD step solving the equations of motion

$$\vec{r}_i(t_n) \rightarrow \vec{r}_i(t_{n+1}), \quad \vec{v}_i(t_n) \rightarrow \vec{v}_i(t_{n+1})$$

Calculate thermodynamical parameters.  
Check energy conservation.  
Output to the trajectory file.

$t_{n+1} > t_{MAX}$  ?

no

yes

Exit

# Monte-Carlo: Metropolis algorithm

Set initial coordinates and positions

$$\vec{r}_i(t_0) = \vec{r}_{i0}, \quad \vec{v}_i(t_0) = \vec{v}_{i0}, \quad i = 1, \dots, N$$

Randomly displace particles

$$\vec{r}_i^{n+1} \rightarrow \vec{r}_i^n + \vec{\xi}_i, \quad \xi_i \in [0, \xi_{\max}], \quad \rho(\xi) = 1/\xi_{\max}$$

Calculate the potential energy change

$$U^{n+1} = U(\vec{r}_1^{n+1}, \dots, \vec{r}_N^{n+1}), \quad \Delta U = U^{n+1} - U^n$$

Accept with the given probability:

$$\begin{cases} \Delta U < 0 \Rightarrow \rho = 1 \\ \Delta U > 0 \Rightarrow \rho = \exp(-\beta \Delta U) \end{cases}$$

*Return to the previous state*

*the move is accepted*

*Next step*

$$n > n_{\text{MAX}}$$

Exit

*no*

*yes*

# Equations of motion in Classical MD

Consider a **system of  $N$  particles with** positions

$$\vec{R} = \{\vec{r}_1, \dots, \vec{r}_N\} \text{ and velocities } \vec{V} = \{\vec{v}_1, \dots, \vec{v}_N\}.$$

**The Newton's equations of motion:**

$$\begin{cases} \ddot{\vec{r}}_k(t) = \frac{1}{m_k} \vec{F}_k(t, \vec{r}_1, \dots, \vec{r}_N), & k = \overline{1, N}, \\ \vec{R}(0) = \vec{R}_0, & \vec{V}(0) = \vec{V}_0. \end{cases}$$

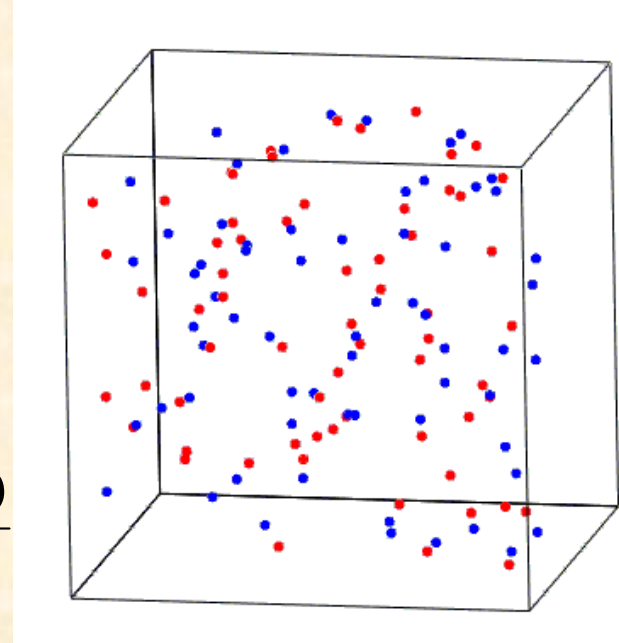
**Force** acting of  $k$ -th particle:  $\vec{F}_k(\vec{R}) = -\frac{\partial U(\vec{R})}{\partial \vec{r}_k}$

General form of the **interaction potential:**

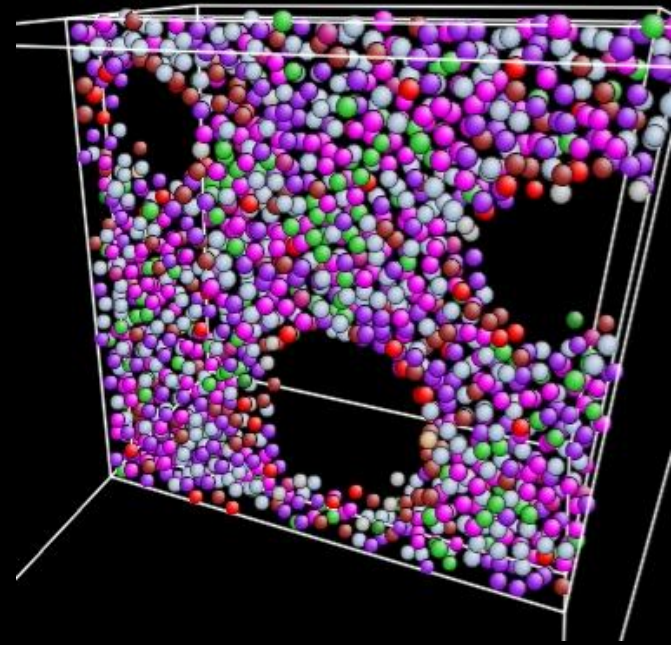
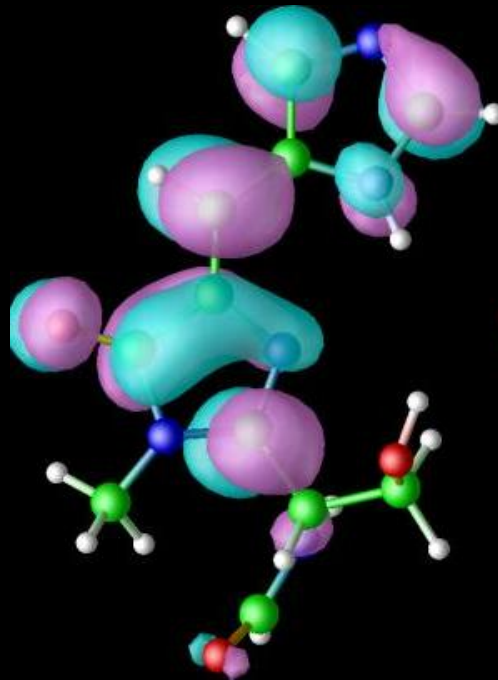
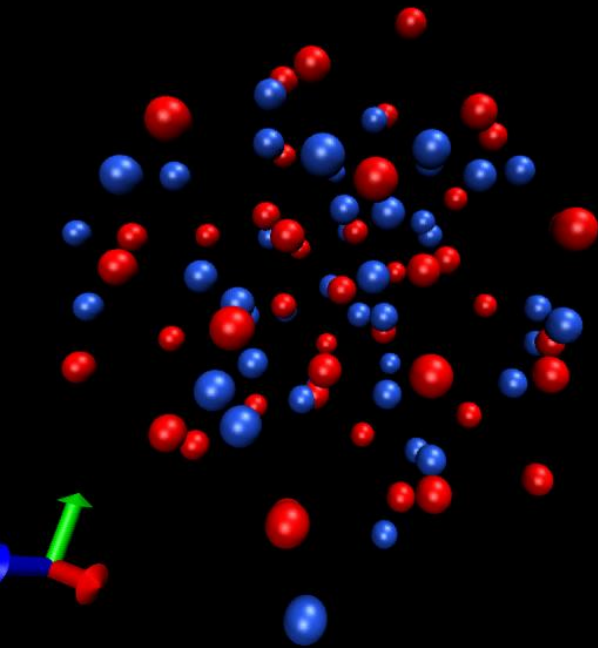
$$U(\vec{R}) = \sum_k U^{ext}(t, \vec{v}_k, \vec{r}_k) + \sum_{i < j} U(\vec{r}_i, \vec{r}_j) + \sum_{i < j < k} \Phi(\vec{r}_i, \vec{r}_j, \vec{r}_k) + \dots$$

Particular case of the **pairwise** potential:

$$U(\vec{r}_i, \vec{r}_j) = U(|\vec{r}_i - \vec{r}_j|) = U(r_{ij}) \quad \vec{F}_k^{pair} = -\sum_j \frac{\vec{r}_{kj}}{r_{kj}} \frac{\partial U(r_{kj})}{\partial r_{kj}} = \sum_j \frac{\vec{r}_{kj}}{r_{kj}} f(r_{kj})$$



# INTERACTION MODELS





# Interaction models and simulation techniques

- Particle-in-cell, hydrodynamic codes
- Coarse-grained, discontinuous molecular dynamics

- Simple pairwise potentials for atoms or molecules with fixed atomic bonds
- Complicated many-body potentials for atoms (EAM, MEAM, ReaxFF, Tersoff, etc.)
- Classical MD for electrons and ions
- Wave Packet MD, Electron Force Field

- QM/MM hybrid models
- Quantum MD (Car-Parinello, DFT, TD-DFT)
- Numerical solution of the Schrödinger equation



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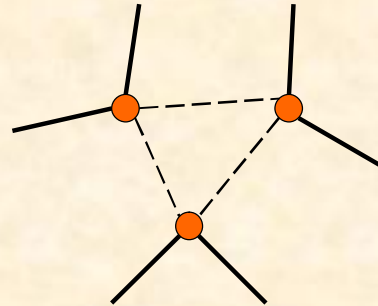
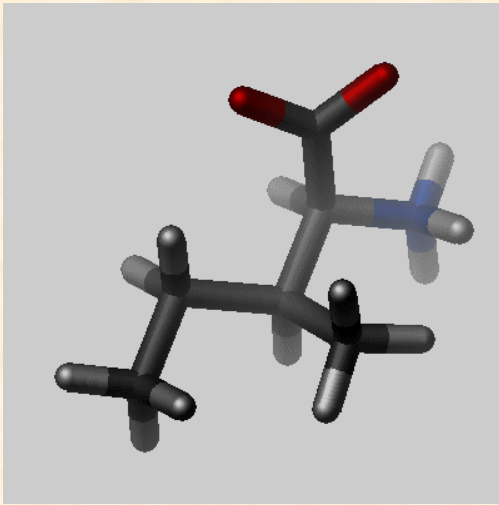
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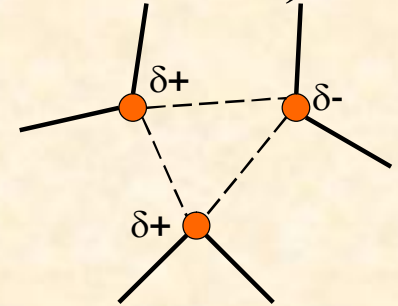


# Force field for interaction of atoms in a molecule

$$U(\vec{r}_1, \dots, \vec{r}_N) = \sum_{i=1}^N \sum_{j=i+1}^N \left( 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}} \right) +$$

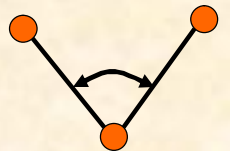
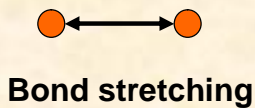


Non-bonded interactions  
(van der Waals)

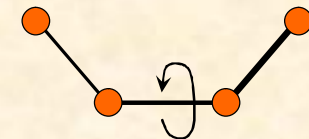


Non-bonded interactions  
(electrostatic)

$$+ \sum_{\text{bonds}} \frac{k_i}{2} (l_i - l_{i,0})^2 + \sum_{\text{angles}} \frac{\tilde{k}_i}{2} (\theta_i - \theta_{i,0})^2 + \sum_{\text{torsions}} \frac{V_n}{2} (1 + \cos(n\omega - \gamma))$$

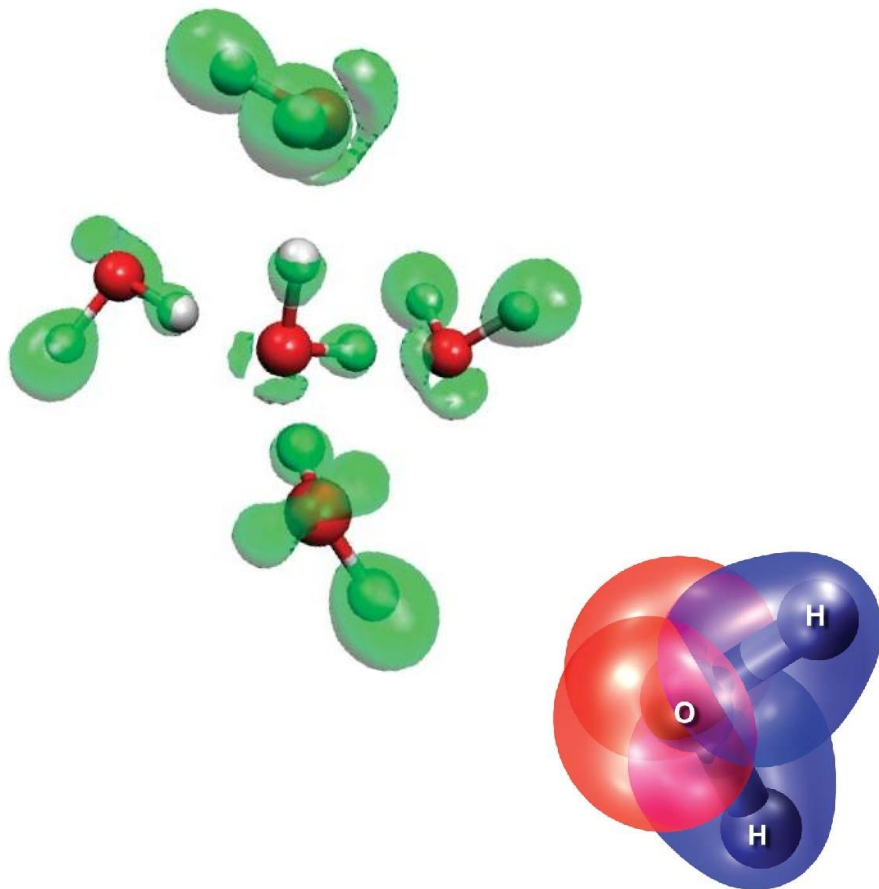


Angle bending



Bond rotation  
(torsion)

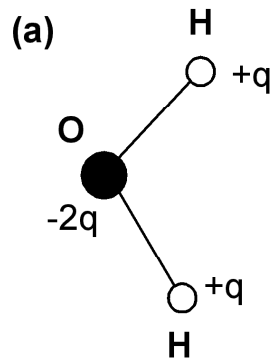
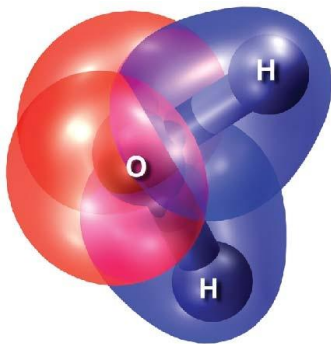
# Classical Molecular Models of Water



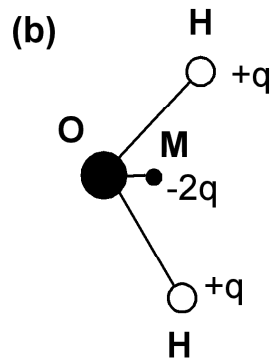
Acronym (date)	Reference	Status	Type	Sites	$\mu_g(D)$	$\mu_l(D)$
BF (1933)	7	empirical	R	4	2.0	2.0
R (1951)	21	empirical	R	5	1.84	1.84
BNS (1971)	22	empirical	R	5	2.17	2.17
ST2 (1973,1993)	23	empirical	R	5	2.35	2.35
CF (1975,1978,1995)	24	empirical	F	3	1.86	1.98
MCY (1976)	25	ab initio	R	4	2.19	2.19
DCF (1978,1980,1993)	26	empirical	F,D,P	3	1.855	-
PE (1979)	27	empirical	P	1	1.855	2.50
SPC (1981)	14	empirical	R	3	2.27	2.27
TIP3P (1981,1983)	15	empirical	R	3	2.35	2.35
RWK (1982)	28	empirical	F	4	1.85	1.89
TIP4P (1983)	15	empirical	R	4	2.18	2.18
BJH (1983)	29	empirical	F	3	1.87	1.99
SPC/F (1985)	30	empirical	F	3	2.27	2.42
MCYL (1986)	31	ab initio	F	4	2.19	2.26
SPC/E (1987)	32	empirical	R	3	2.35	2.35
WK (1989)	33	empirical	R	4	2.60	2.60
SPCP (1989)	34	empirical	P	3	1.85	2.90
CKL (1990)	35	empirical	F,P	4	1.88	2.20
MCHO (1990)	36	ab initio	P	6	2.12	≈3.0
NCC (1990)	37	ab initio	P	6	1.85	2.80
NEMO (1990,1995)	38	ab initio	P	5	2.04	2.89
PTIP4P (1991)	39	empirical	P	4	1.85	2.80
SPC/FP (1991)	40	empirical	F,P	3	1.85	2.44
PSRWK (1991)	41	empirical	P	4	1.88	2.63
KJ (1992)	42	empirical	P	4	1.85	-
NCCvib (1992)	37b	ab initio	F,P	6	1.85	3.11
ASP-W (1992,1998)	43	ab initio	P	3	1.85	2.90
RPOL (1992)	44	empirical	P	3	2.02	2.62
CPMD (1993,1999)	45	DFT+CP	F,D,P	nucl.+el.	1.87	2.95
PPC (1994)	46	ab initio	P	4	2.14	2.51
SPC/FQ (1994)	47	empirical	P	3	1.85	2.83
TIP4P/FQ (1994)	47	empirical	P	4	1.85	2.62
KKY (1994)	48	empirical	F,D	3	2.38	2.21
SQPM (1995)	49	valence bond	P	4	1.85	2.62
SCPDP (1996)	50	empirical	P	4	1.85	2.87
TAB/10D (1998)	51	SCF+MD	P	5	1.85	2.65
NSPCE (1998)	52	empirical	R	3	2.18	2.18
NCF (1998)	53	empirical	F	3	1.85	1.90
MCDHO (2000)	54	ab initio	F, P	4	1.85	3.01
TIP5P (2000)	55	empirical	R	5	2.29	2.29
SPC/HW (2001)	56	empirical	R	3	2.41	2.41
DEC (2001)	57	empirical	R	3	1.85	1.85
SWFLEX (2001)	58	empirical	P	4	1.85	2.59
POLARFLEX (2001)	59	valence bond	F,P	3	1.85	2.55
POL5 (2001)	60	ab initio	P	5	1.85	2.71

- Guillot B (2002) What we have learnt during three decades of computer simulations on water. *Journal of Molecular Liquids* **101**, 219-260.
- Finney JL (2004) Water? What's so special about it? *Phil. Trans. R. Soc. Lond. B* **359**, 1145-1165.

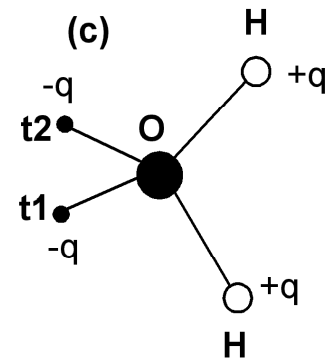
# The Structure of H<sub>2</sub>O Molecule and Classical Intermolecular Potentials



SPC  
SPC/E  
TIP3P



MCY  
TIPS2  
TIP4P



BNS  
ST2  
TIP5P

$$U = \sum \sum (A_{ij}/r_{ij}^{12} - B_{ij}/r_{ij}^6 + q_i q_j / \epsilon_0 r_{ij}) +$$

Short-range repulsion    Van der Waals    Coulombic

$$+ \sum \frac{1}{2} k_b (r_{ij} - r_0)^2 + \sum \frac{1}{2} k_\theta (\theta_{ij} - \theta_0)^2$$

bond stretching                      bond bending

- 💧 *Ab-initio* quantum mechanical
- 💧 Empirical and semi-empirical
- 💧 Rigid vs flexible
- 💧 Point polarizability
- 💧 “Charges on springs” models
- 💧 Core-shell models

# Interaction models and simulation techniques

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# Many-body Tersoff potential

$$E = \sum_{i < j}^N U_{ij}$$

$$U_{ij} = \left[ A e^{-\lambda_1 r_{ij}} - B_{ij} e^{-\lambda_2 r_{ij}} \right] f_c(r_{ij})$$

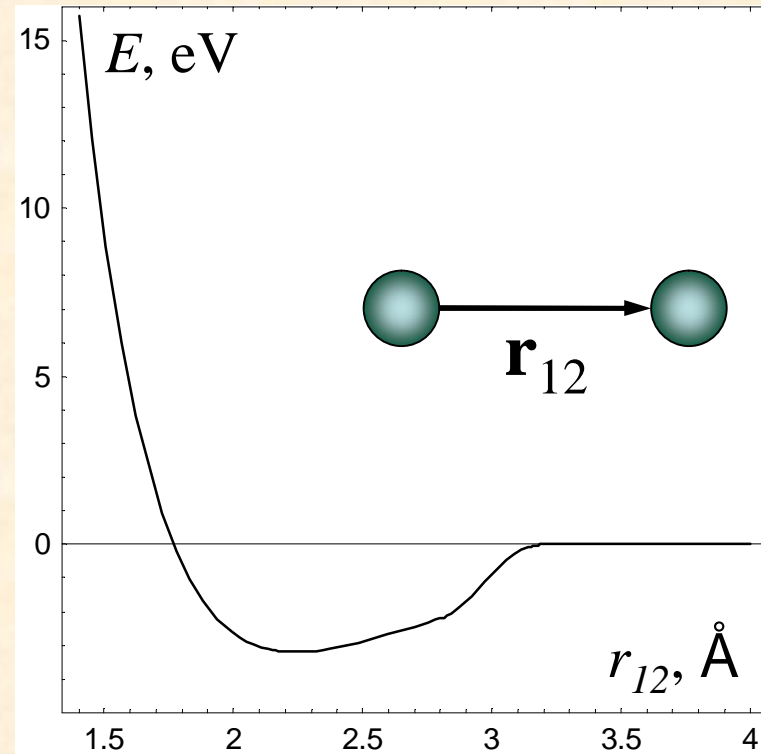
$$B_{ij} = B_0 e^{-z_{ij}/b},$$

$$z_{ij} = \sum_{k \neq i, j} \left[ \frac{w(r_{ik})}{w(r_{ij})} \right]^n \left( c + e^{-d \cos \theta_{ijk}} \right),$$

$$w(r) = f_c(r) e^{-\lambda_2 r}.$$

Parameters for Si:

([J. Tersoff, Phys. Rev. B, 37 \(1988\) 6991](#))



$$A = 2280 \text{ eV}, \quad B_0 = 171 \text{ eV}, \quad \lambda_1 = 2\lambda_2, \quad \lambda_2 = 1.465 \text{ \AA}^{-1},$$

$$b = 1.324, \quad c = 6.5, \quad d = 6.02, \quad n = 4,$$

$$f_c = \begin{cases} 1, & r < R - D, \\ \frac{1}{2} - \frac{1}{2} \sin\left[\frac{1}{2}\pi(r - R)/D\right], & R - D < r < R + D, \\ 0, & r > R + D, \end{cases}$$

$$R = 3.0 \text{ \AA}, \quad D = 0.2 \text{ \AA}$$

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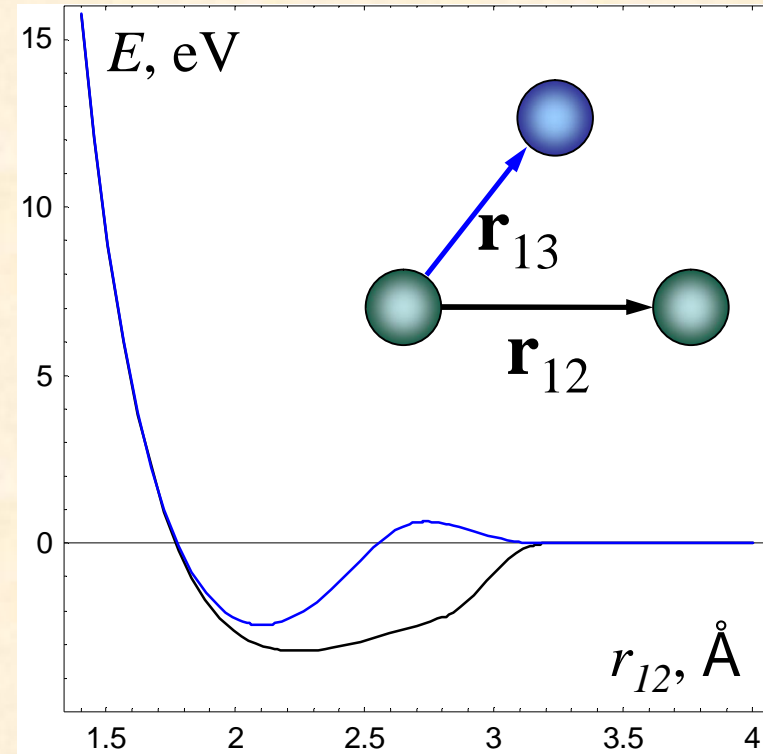
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$$f_c = \begin{cases} 1, & r < R - D, \\ \frac{1}{2} - \frac{1}{2} \sin\left[\frac{1}{2}\pi(r - R)/D\right], & R - D < r < R + D, \\ 0, & r > R + D, \end{cases}$$

$$R = 3.0 \text{ \AA}, \quad D = 0.2 \text{ \AA}$$



# Many-body Tersoff potential

$$E = \sum_{i < j}^N U_{ij}$$

$$U_{ij} = \left[ A e^{-\lambda_1 r_{ij}} - B_{ij} e^{-\lambda_2 r_{ij}} \right] f_c(r_{ij})$$

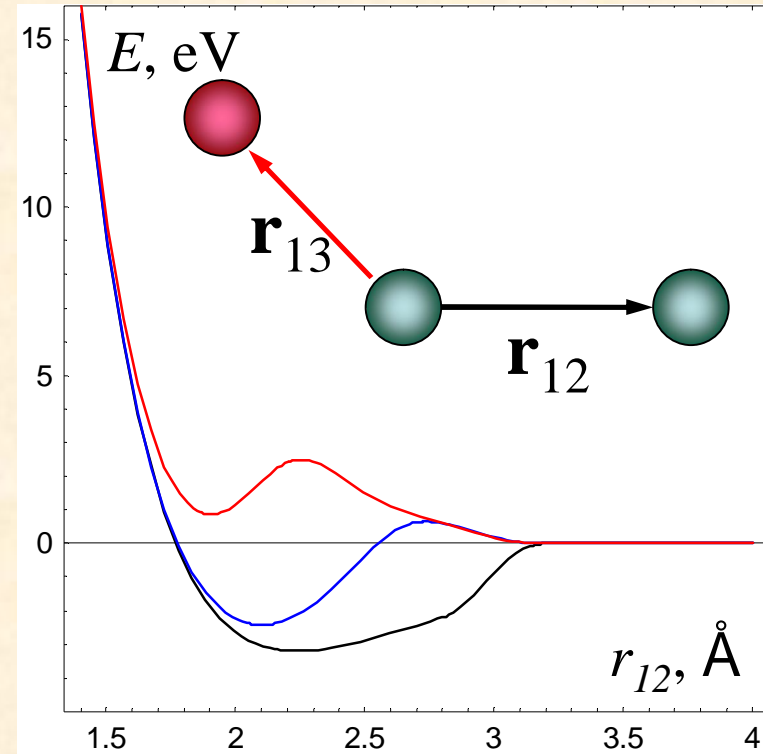
$$B_{ij} = B_0 e^{-z_{ij}/b},$$

$$z_{ij} = \sum_{k \neq i, j} \left[ \frac{w(r_{ik})}{w(r_{ij})} \right]^n \left( c + e^{-d \cos \theta_{ijk}} \right),$$

$$w(r) = f_c(r) e^{-\lambda_2 r}.$$

Parameters for Si:

(J. Tersoff, Phys. Rev. B, [37 \(1988\) 6991](#))



$$A = 2280 \text{ eV}, \quad B_0 = 171 \text{ eV}, \quad \lambda_1 = 2\lambda_2, \quad \lambda_2 = 1.465 \text{ \AA}^{-1},$$

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$$R = 3.0 \text{ \AA}, \quad D = 0.2 \text{ \AA}$$

# Embedded Atom Method - EAM

Electron density  
(transfer function)

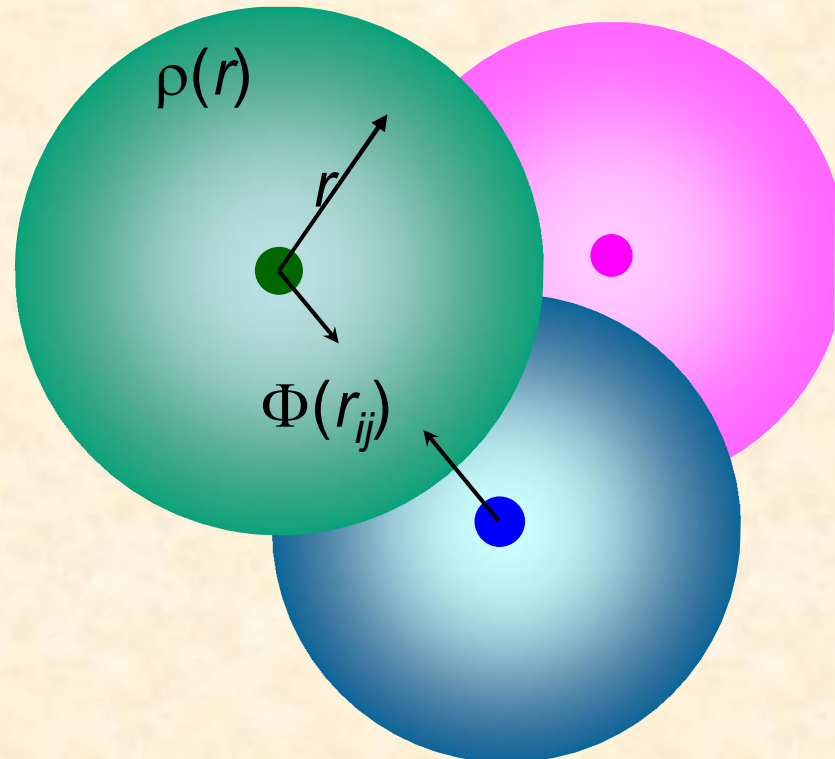
$$U = \sum_i F_i \left( \sum_{j \neq i} \rho_j(r_{ij}) \right) + \sum_{i < j} \Phi_{ij}(r_{ij})$$

Embedding function

Pair potential

?

$$\neq \sum_i \sum_{j \neq i} U(\vec{r}_{ij})$$



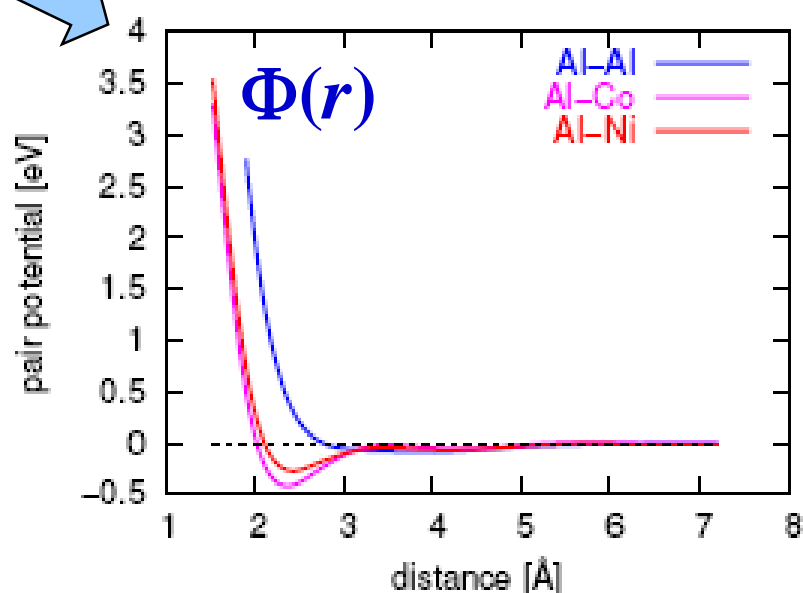
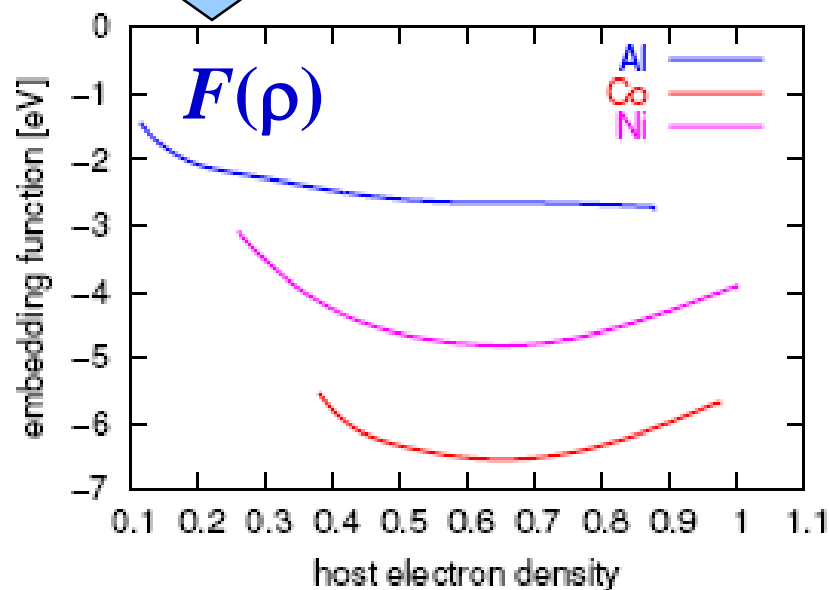
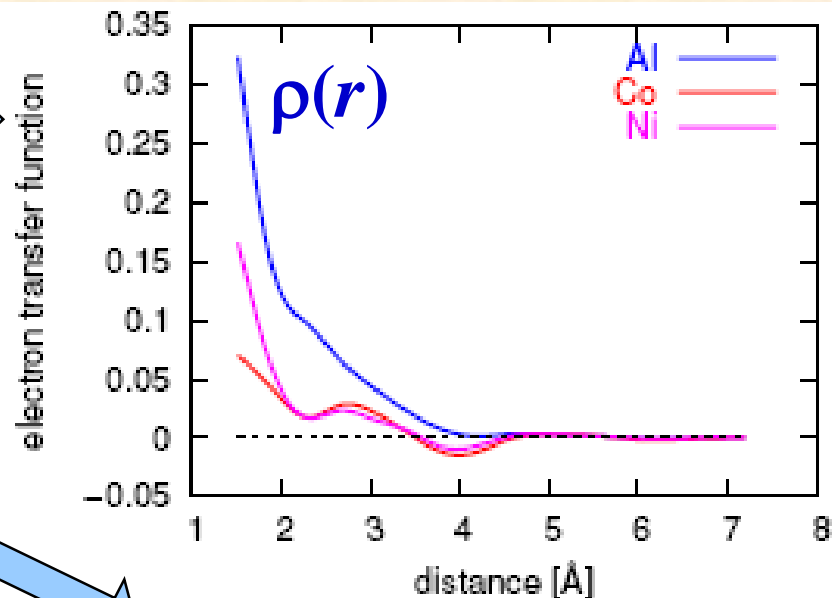
# Embedded Atom Method - EAM

$$U = \sum_i F_i \left( \sum_{j \neq i} \rho_j(r_{ij}) \right) + \sum_{i < j} \Phi_{ij}(r_{ij})$$

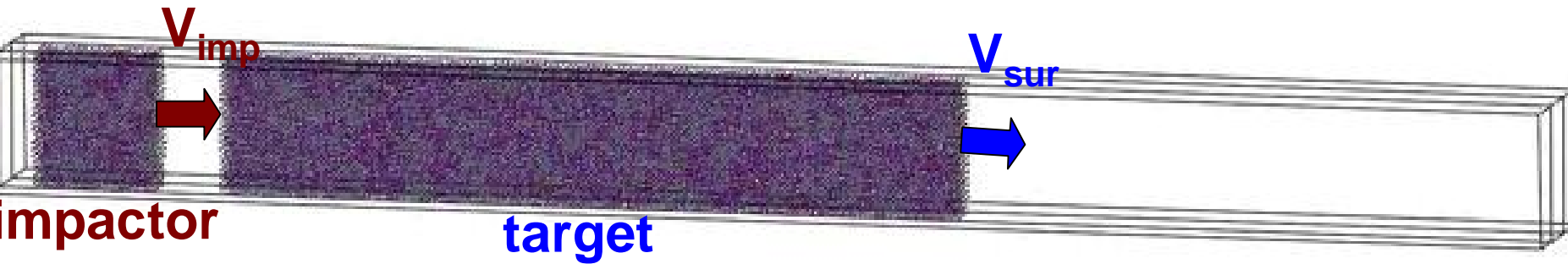
**Electron density (transfer function)**  $\rho_j(r_{ij})$

**Embedding function**  $F_i$

**Pair potential**  $\Phi_{ij}(r_{ij})$



# Atomistic model of spallation process at high rate shock\*



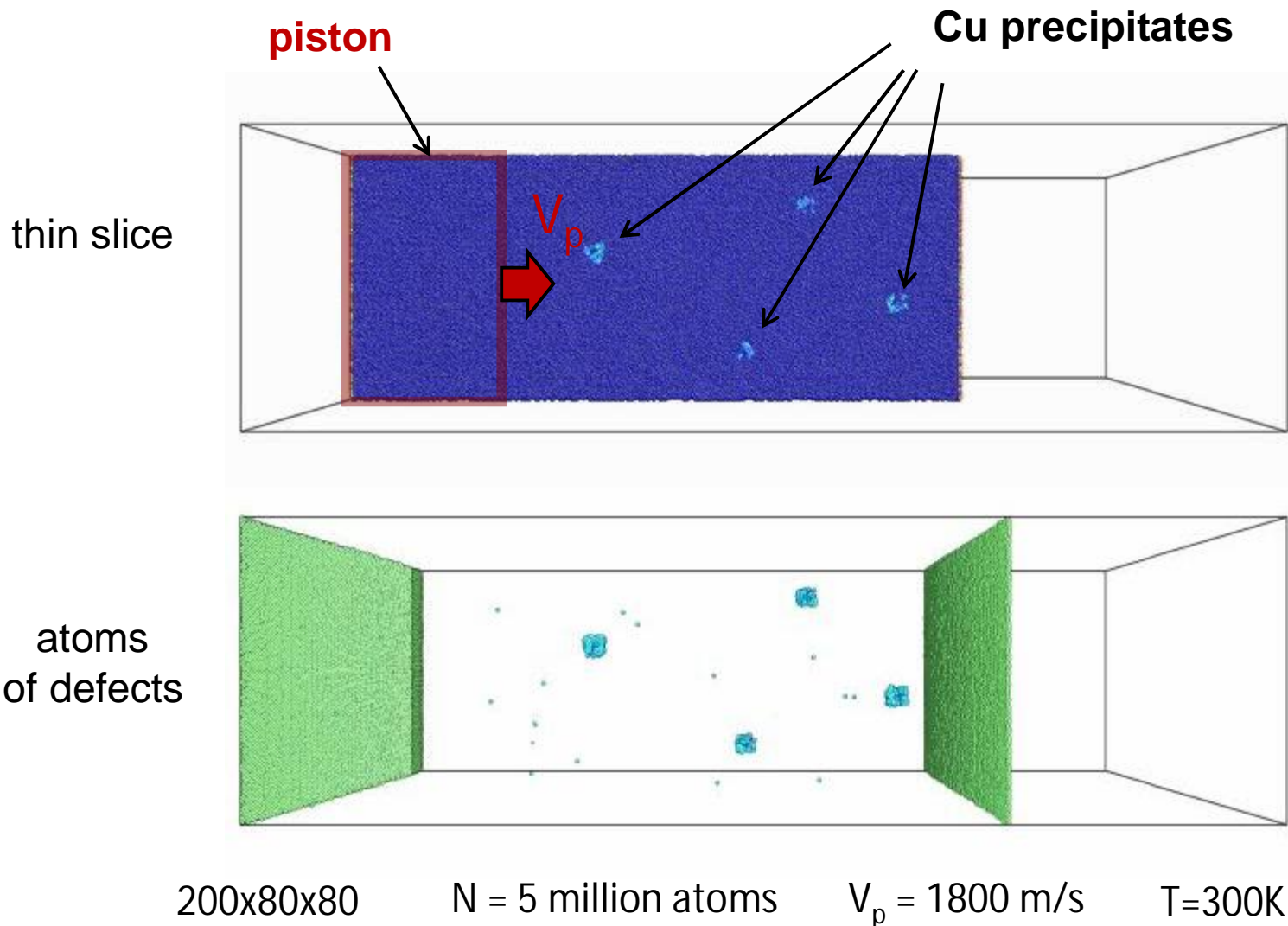
## Model parameters:

1.  $T = 300 \text{ K}$
2. Number of Cu atoms 112 000
3. Impactor / target mass ratio 1/6
4. Initial defect number density 0.05



\* A. Yu. Kuksin, G.E.Norman, V. V. Stegailov, and A. V. Yanilkin  
Thermophysics, 2009, Vol. 18, No. 3, pp. 197–226.

# Shock wave in Al crystal with Cu precipitates



\* A. Yu. Kuksin, G.E.Norman, V. V. Stegailov, and A. V. Yanilkin // Journal of Engineering Thermophysics, 2009, Vol. 18, No. 3, pp. 197–226.

# The ReaxFF Interatomic Potential

Developed by Adri van Duin:

van Duin ACT, Dasgupta S, Lorant F, Goddard WA, *J. Phys. Chem A*. 105 9396 (2001) (183 citations up to Feb 2010)

Describes bond formation and charge transfer in condensed phases, especially organics

Bonded interactions generated on-the-fly, based on distance-dependent bond-order functions.

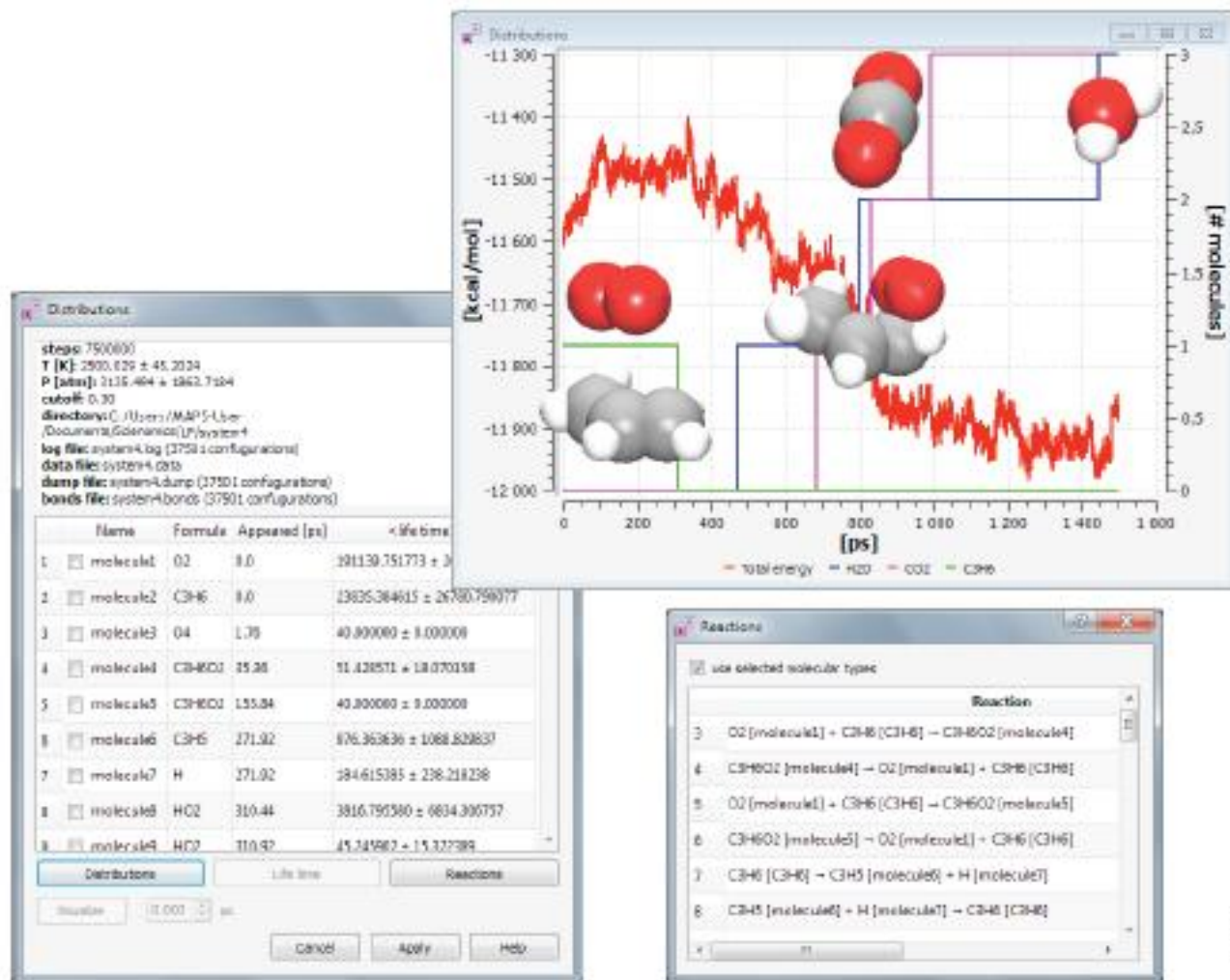
Bond-orders adjusted to compensate for atomic over/under-coordination

Atom charges computed using electro-negativity equalization i.e. minimizing quadratic function in  $N$  charges (Coulombic plus ionization energies)

$$\begin{aligned} E_{System} &= E_{bond} + E_{over/under} + E_{lp} + E_{pen} + E_{coa} + E_{hb} + E_{tors} + E_{conj} + E_{val} + E_{vdW} + E_{Coul} \\ &= E(\text{bond-order}) + E(\text{non-bond}) + E(\text{charge equilibration}) \end{aligned}$$



# The ReaxFF Interatomic Potential



*Butene oxidation, characteristic configuration obtained after 1.5 ns*

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# Interaction models and simulation techniques

- Particle-in-cell, hydrodynamic codes
- Coarse-grained, discontinuous molecular dynamics

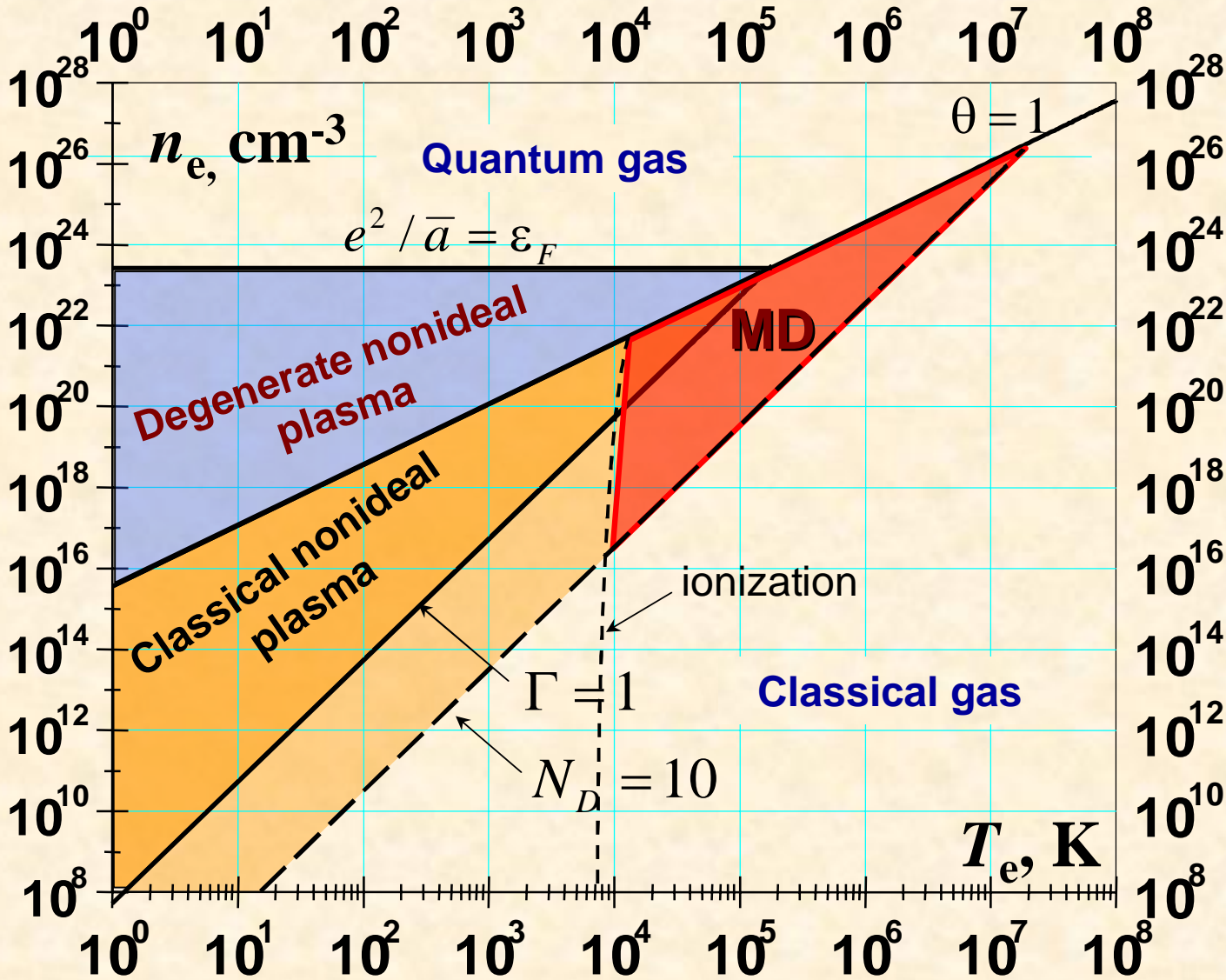
- Simple pairwise potentials for atoms or molecules with fixed atomic bonds
- Complicated many-body potentials for atoms (EAM, MEAM, ReaxFF, Tersoff, etc.)
- **Classical MD for electrons and ions**
- Wave Packet MD, Electron Force Field

- QM/MM hybrid models
- Quantum MD (Car-Parinello, DFT, TD-DFT)
- Numerical solution of the Schrödinger equation





# Density-Temperature Diagram



**Nonideality parameter for electrons**

$$\Gamma = \left( \frac{4\pi n_e}{3} \right)^{1/3} \frac{e^2}{kT}$$

**Number of electrons in the Debye sphere**

$$N_D = \frac{4\pi r_D^3}{3} n_e$$

**Degeneracy parameter**

$$\theta = \varepsilon_F / kT$$

# Breaking into the atom

## Approximations, restrictions and gains

---

1. ~~BO approx. (adiabatic approx.)~~

~~No nonadiabatic processes (charge-transfer reactions, photochemistry)~~

2. ~~Ground state~~

~~No electronic excitations, no electron-phonon coupling, etc~~

3. ~~Classical approx. for nuclei movement~~

~~No proton transfer, atom tunneling, etc~~

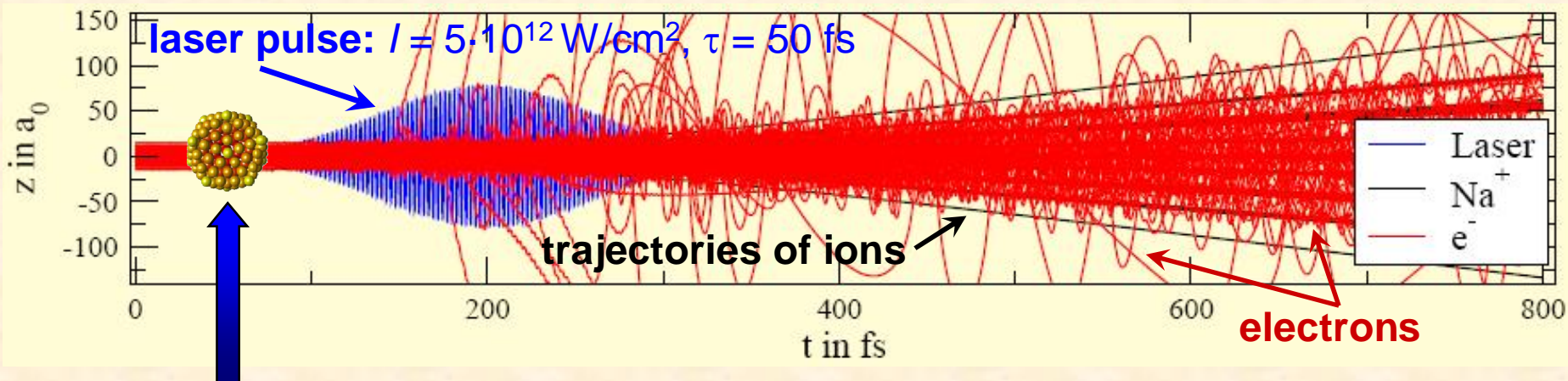
On the good side – big systems, long evolution times,  
nice parallelization and scaling

TD Schrödinger eq. – 3 atoms

MD –  $10^9$  atoms, up to milliseconds

# MD simulations of ionized sodium clusters

## *Ionization and cluster expansion «Coulomb explosion»*



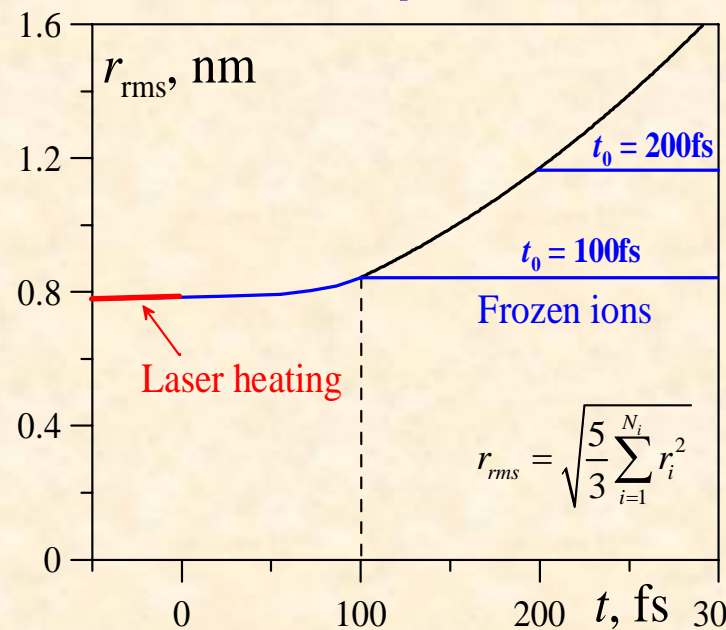
❑ In the initial state the ions are located in the nodes of Na55 icosahedral crystal. Electrons are on top of ions.

❑ Ion-electron mass ratio is **41910**

❑ Erf-like electron ion potential is used with  $U_{min} = -5.1 \text{ eV}$

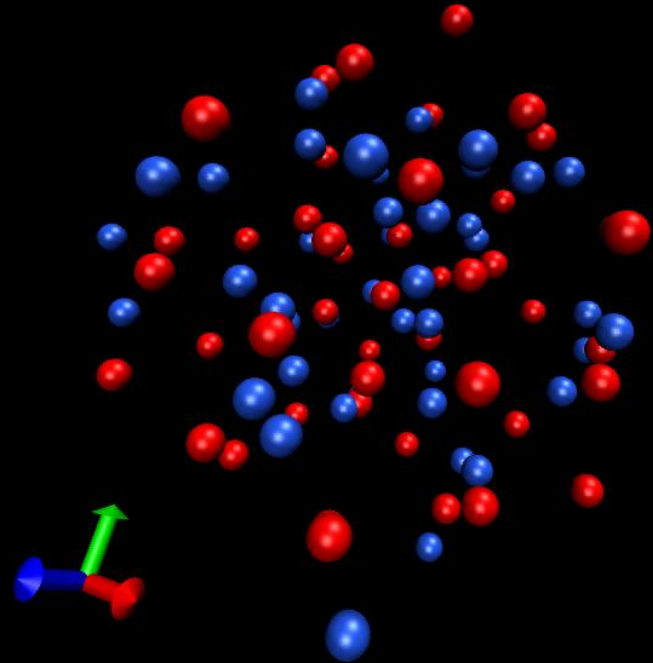
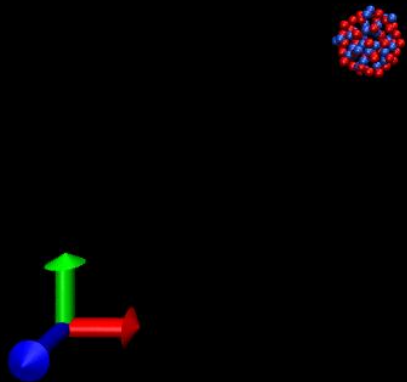
❑ Typical times of:  
cluster expansion > **100fs**  
electron oscillations < **1fs**

## *Cluster expansion*

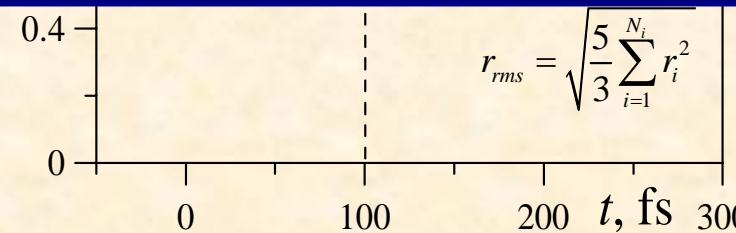


# MD simulations of ionized sodium clusters

*Ionization and cluster expansion «Coulomb explosion»*



□ Typical times of:  
cluster expansion > 100fs  
electron oscillations < 1fs



# Visualization of particle motion in MD cell

$N_{bound} = 0$

$t = 0$

● – electron

● – ion

● – bound electron

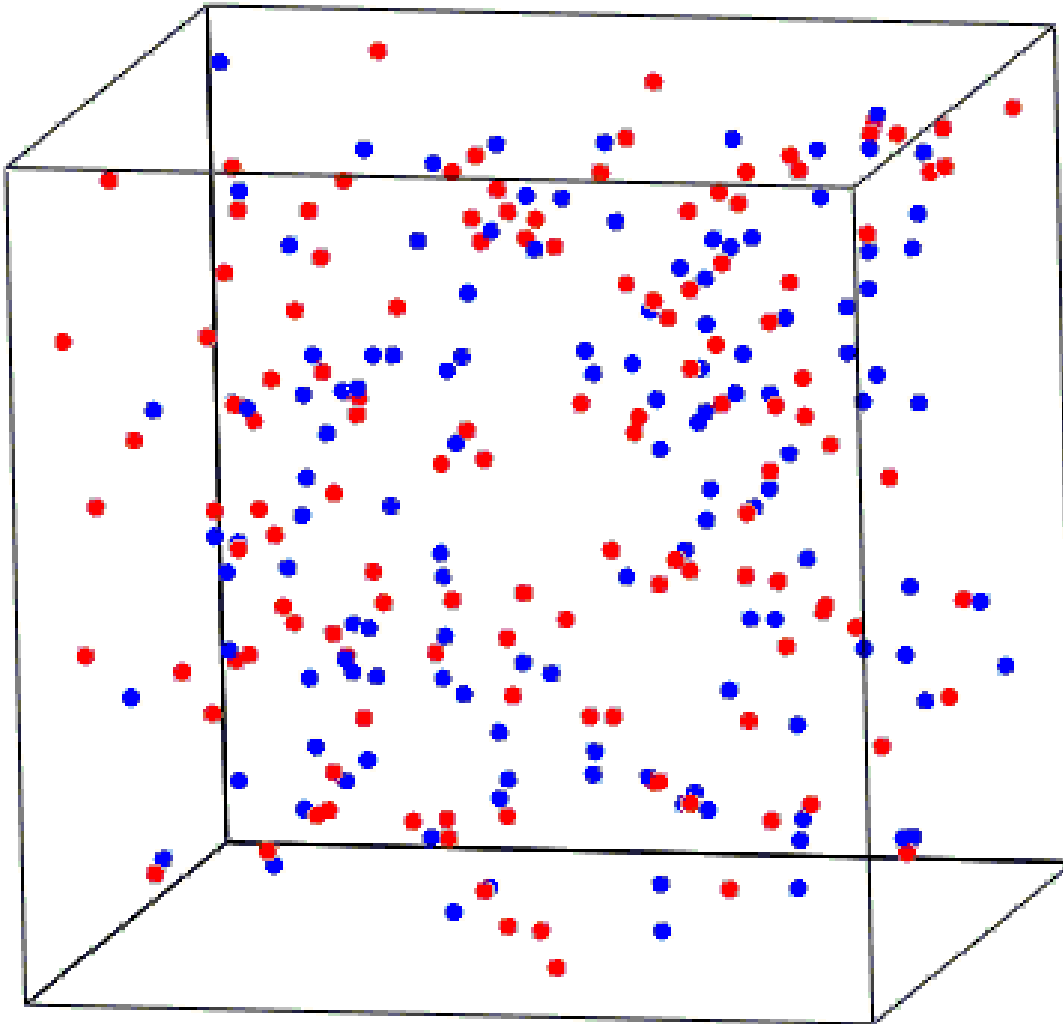
● – bound ion

*An electron is marked as bound if it makes at least one complete revolution around an ion.*

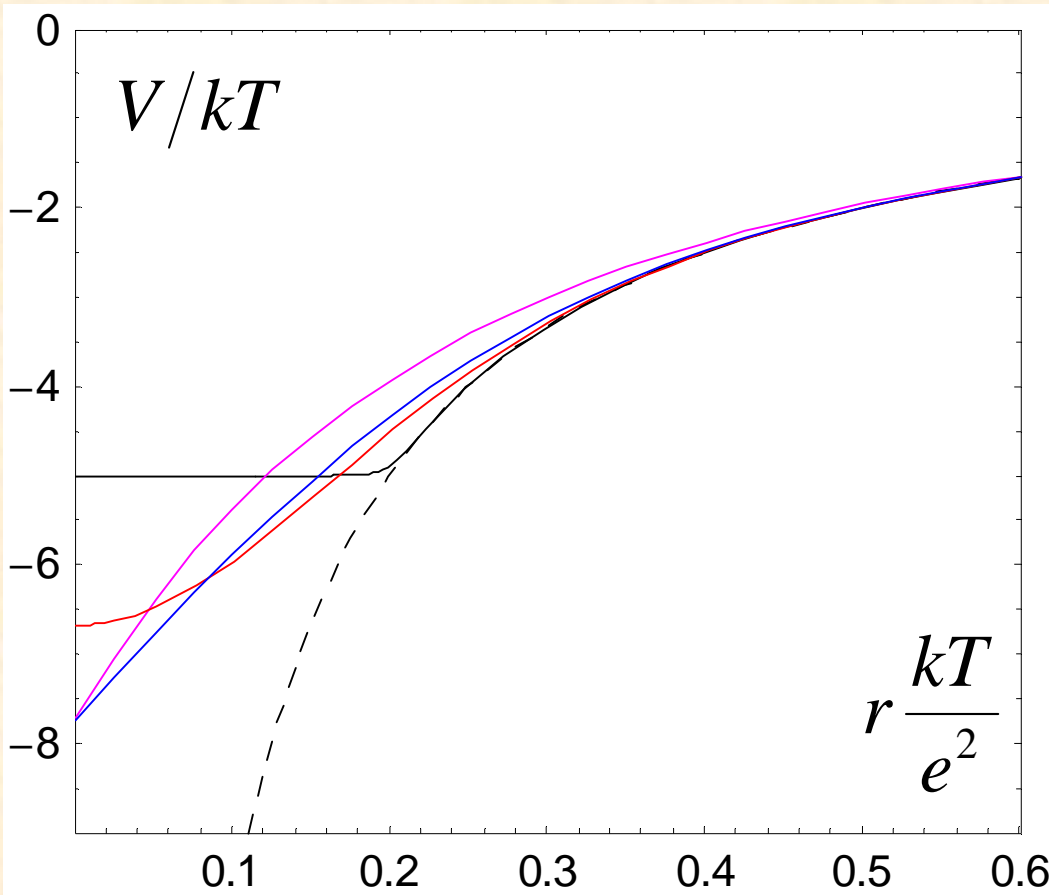
$N = 128$

$\Gamma = 1.28$

$M/m = 10$



# Models for electron-ion interaction potentials



**Coulomb**  $\frac{1}{r}$

**Cut-off**  $\frac{1}{r}, r > \frac{1}{\varepsilon}; \quad -\varepsilon, r \leq \frac{1}{\varepsilon}$

**Deutsch**  $\frac{1}{r} \left[ 1 - \exp\left(-\frac{r}{\lambda_{ei}}\right) \right]$

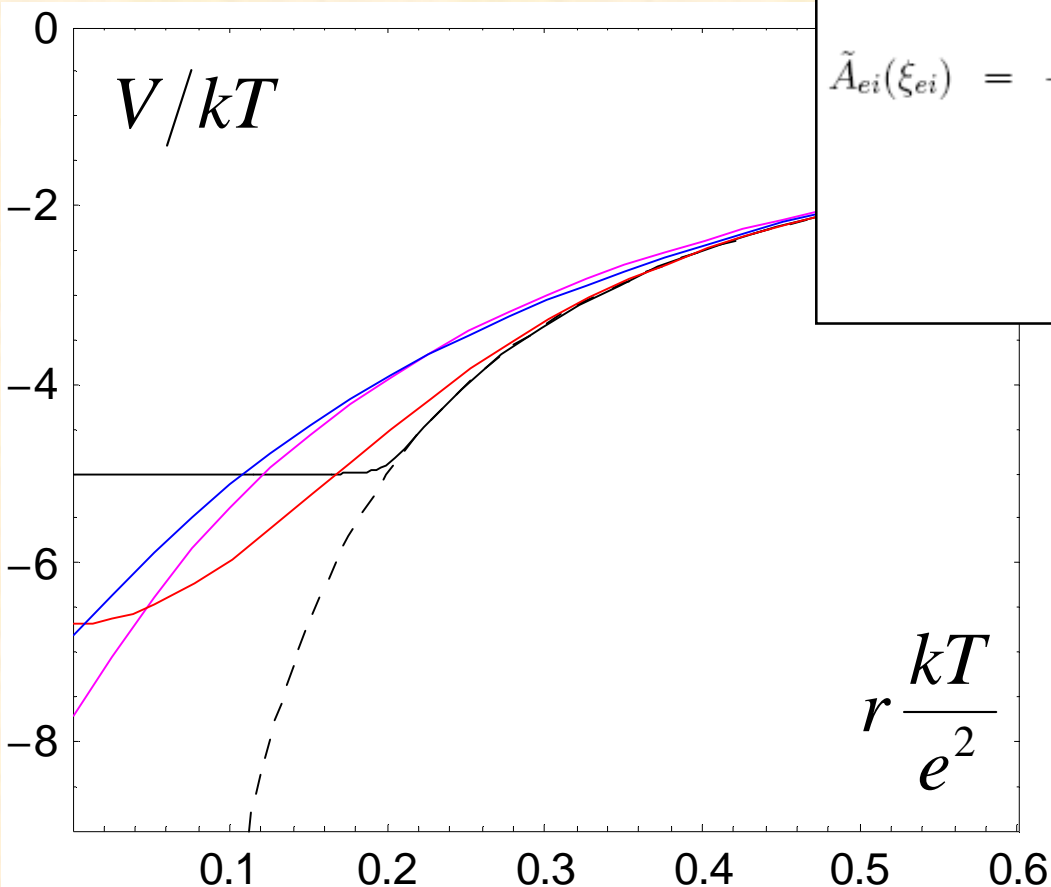
$$\lambda_{ie} = \lambda_{th} = \hbar / \sqrt{mkT}$$

**Error function**  $\frac{1}{r} \operatorname{erf}\left(-\frac{r}{\lambda_{ei}}\right)$

**Kelbg**  $\frac{1}{r} F\left(\frac{r}{\Lambda_{ei}}\right)$

$$F(x) = 1 - \exp(-x^2) + \sqrt{\pi}x(1 - \operatorname{erf}(x)) \quad \Lambda_{ie} = \hbar / \sqrt{2mkT}$$

# Models for electron-ion interaction potentials



$$\tilde{A}_{ei}(\xi_{ei}) = -\sqrt{\pi}\xi_{ei} + \ln \left[ \sqrt{\pi}\xi_{ie}^3 \left( \zeta(3) + \frac{1}{4}\zeta(5)\xi_{ie}^2 \right) + 4\sqrt{\pi}\xi_{ei} \int_0^{\infty} \frac{y \exp(-y^2) dy}{1 - \exp(-\pi\xi_{ei}/y)} \right]$$

**Deutsch**  $\frac{1}{r} \left[ 1 - \exp\left(-\frac{r}{\lambda_{ei}}\right) \right]$

$$\lambda_{ie} = \lambda_{th} = \hbar / \sqrt{mkT}$$

**Error function**  $\frac{1}{r} \operatorname{erf}\left(-\frac{r}{\lambda_{ei}}\right)$

**Corrected Kelbg**  $\frac{1}{r} \left[ F\left(\frac{r}{\Lambda_{ei}}\right) + r \frac{kT}{e^2} \tilde{A}_{ei}\left(\frac{e^2}{kT\Lambda_{ei}}\right) \exp\left(-\left(\frac{r}{\lambda_{ei}}\right)^2\right) \right]$

$$F(x) = 1 - \exp(-x^2) + \sqrt{\pi}x(1 - \operatorname{erf}(x)) \quad \Lambda_{ie} = \hbar / \sqrt{2mkT}$$

# Interaction models and simulation techniques

- Particle-in-cell, hydrodynamic codes
- Coarse-grained, discontinuous molecular dynamics

- Simple pairwise potentials for atoms or molecules with fixed atomic bonds
- Complicated many-body potentials for atoms (EAM, MEAM, ReaxFF, Tersoff, etc.)
- Classical MD for electrons and ions
- **Wave Packet MD, Electron Force Field**

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- Numerical solution of the Schrödinger equation





# Wave Packet Molecular Dynamics

Gaussian wave packet (WP) for a single particle:

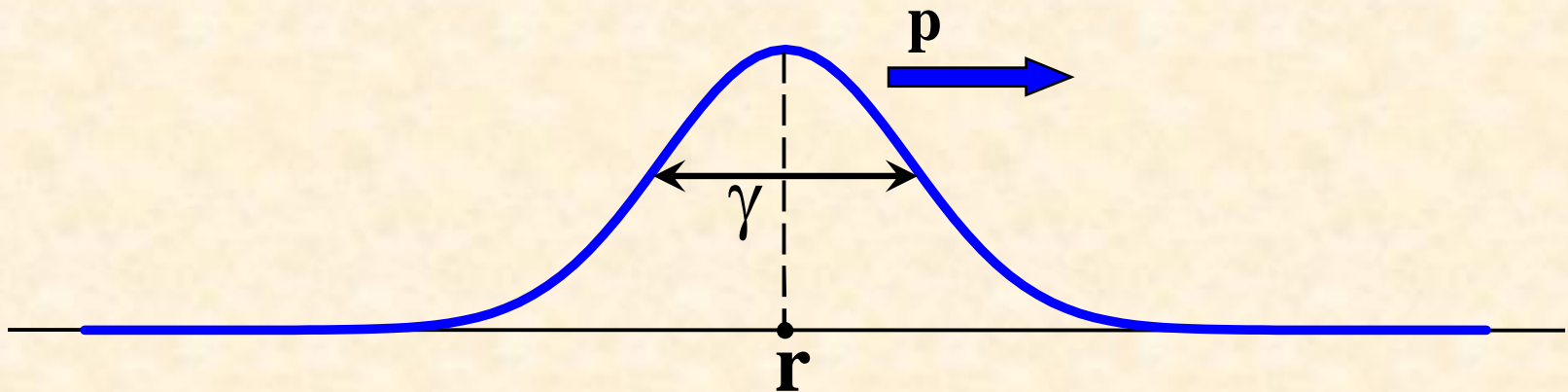
$$\varphi(\mathbf{x}, t) = \left( \frac{3}{2\pi\gamma^2} \right)^{3/4} \exp \left\{ - \left( \frac{3}{4\gamma^2} - \frac{ip_\gamma}{2\hbar\gamma} \right) (\mathbf{x} - \mathbf{r})^2 + \frac{i}{\hbar} \mathbf{p} \cdot (\mathbf{x} - \mathbf{r}) \right\}$$

“Physical” parameters (8 real numbers per particle):

$(\mathbf{r}, \mathbf{p})$  particle coordinate and momentum (3D vectors)

$\gamma$  width of the packet ( $\gamma > 0$ )

$p_\gamma$  “momentum” of the width



# Wave Packet Molecular Dynamics

## Hamiltonian

$$\hat{H} = \hat{K}_e + \hat{V}_{ei} + \hat{V}_{ee} + \hat{H}_{ext} = -\sum_k \frac{\hbar^2}{2m} \Delta_k - \sum_{k,i} \frac{eq_i}{|\hat{\mathbf{x}}_k - \mathbf{R}_i|} + \sum_{k<m} \frac{e^2}{|\hat{\mathbf{x}}_k - \hat{\mathbf{x}}_m|} + \hat{H}_{ext}$$

## Many-electron wave function

$$\Psi(\{\mathbf{x}_k\}, t) = \prod_k \varphi(\mathbf{x}_k, t) \quad (\text{Hartree approximation})$$

## Total energy

$$H = \langle \Psi | \hat{H} | \Psi \rangle = \sum_k \left( \frac{\mathbf{p}_k^2}{2m} + \frac{\mathbf{p}_{\gamma_k}^2}{2m} \right) + \sum_k \frac{9\hbar^2}{8m\gamma_k^2} + \sum_{k<l} \frac{e_k e_l}{r_{kl}} \operatorname{erf} \left( \frac{r_{kl}}{\sqrt{2(\gamma_k^2 + \gamma_l^2)/3}} \right) + H_{ext}$$

## Norm-matrix

$$N_{\alpha\beta} = \frac{\partial}{\partial q_\alpha^* \partial q_\beta} \ln \langle \Psi(\mathbf{q}^*) | \Psi(\mathbf{q}) \rangle$$

$$\mathbf{N} = \begin{pmatrix} 0 & -1 & 0 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & -1 \\ 0 & 0 & 1 & 0 \end{pmatrix}$$

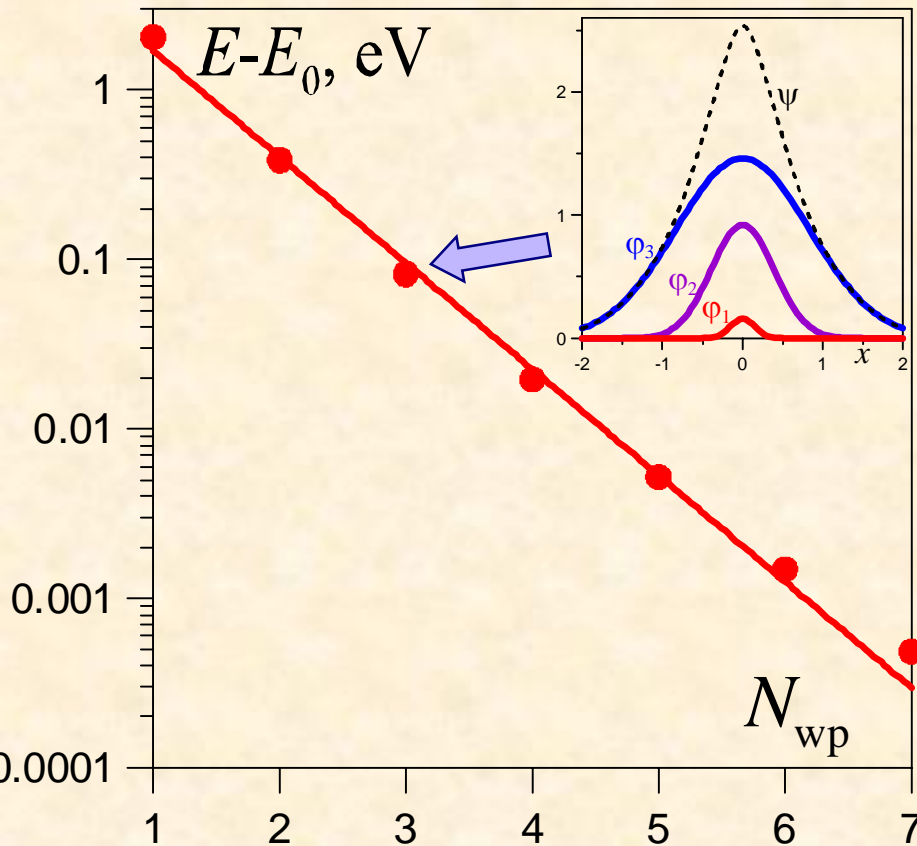
## Equations of motion

$$\sum_\alpha N_{\alpha\beta} \frac{dq_\alpha}{dt} = \frac{\partial H}{\partial q_\beta},$$

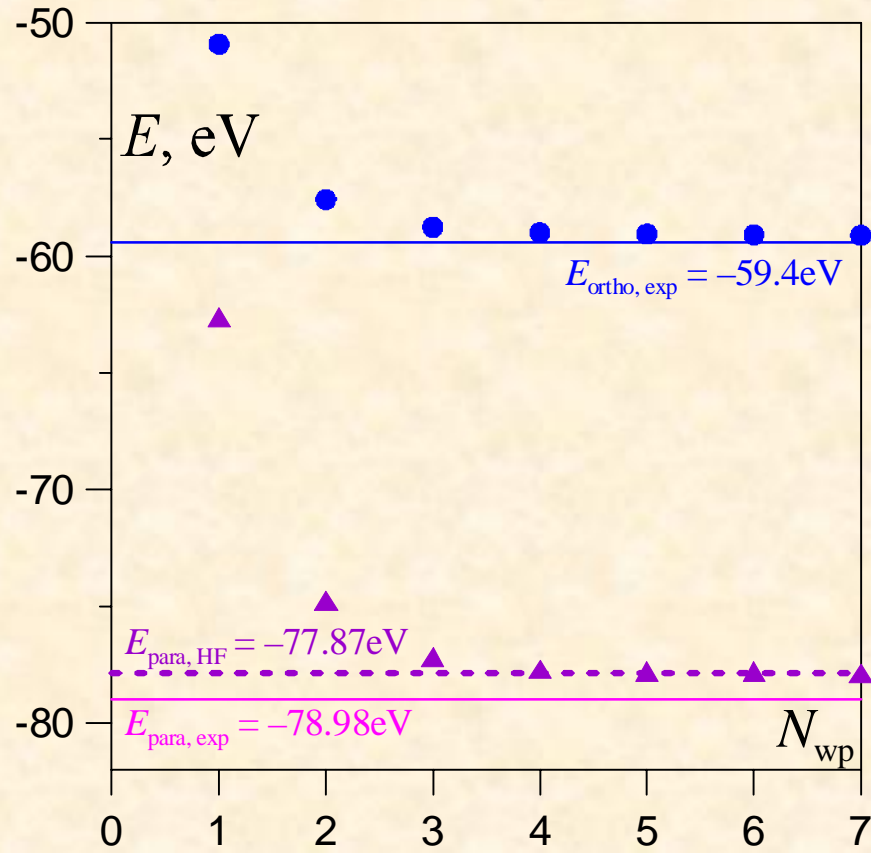
$$\dot{\mathbf{r}}_k(t) = \frac{\partial H}{\partial \mathbf{p}_k}, \quad \dot{\mathbf{p}}_k(t) = -\frac{\partial H}{\partial \mathbf{r}_k}, \quad \dot{\gamma}_k(t) = \frac{\partial H}{\partial p_{\gamma_k}}, \quad \dot{p}_{\gamma_k}(t) = -\frac{\partial H}{\partial \gamma_k}$$

# Ground state of simple atoms represented by multiple Gaussian wave packets

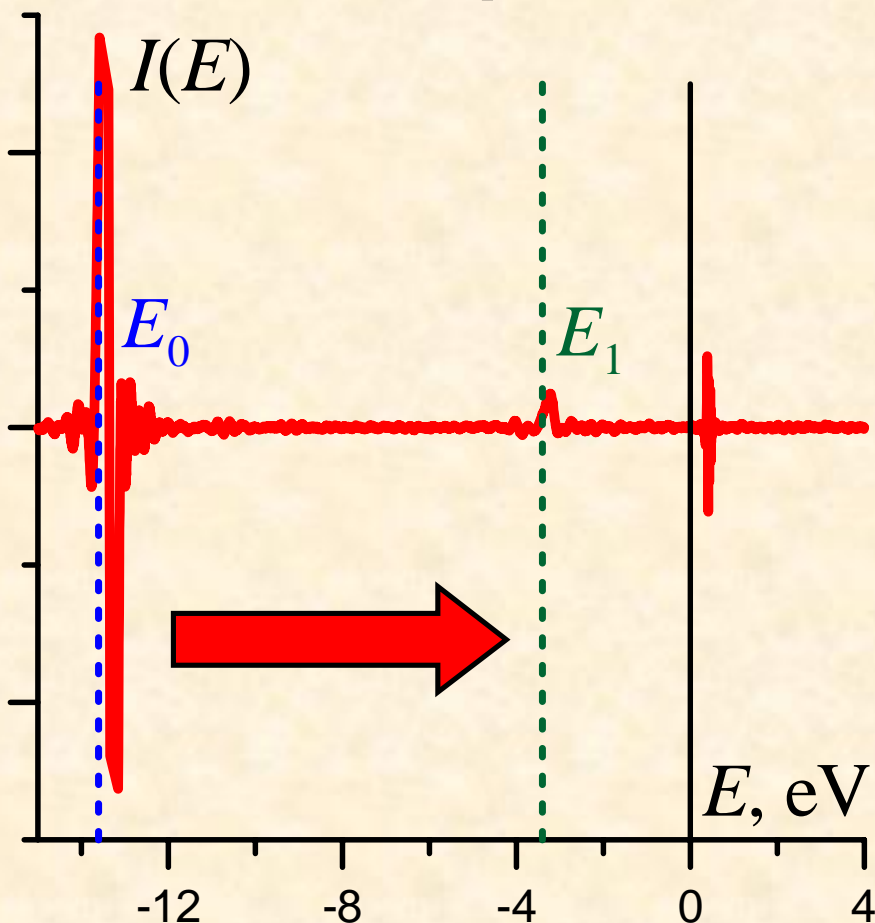
## Hydrogen



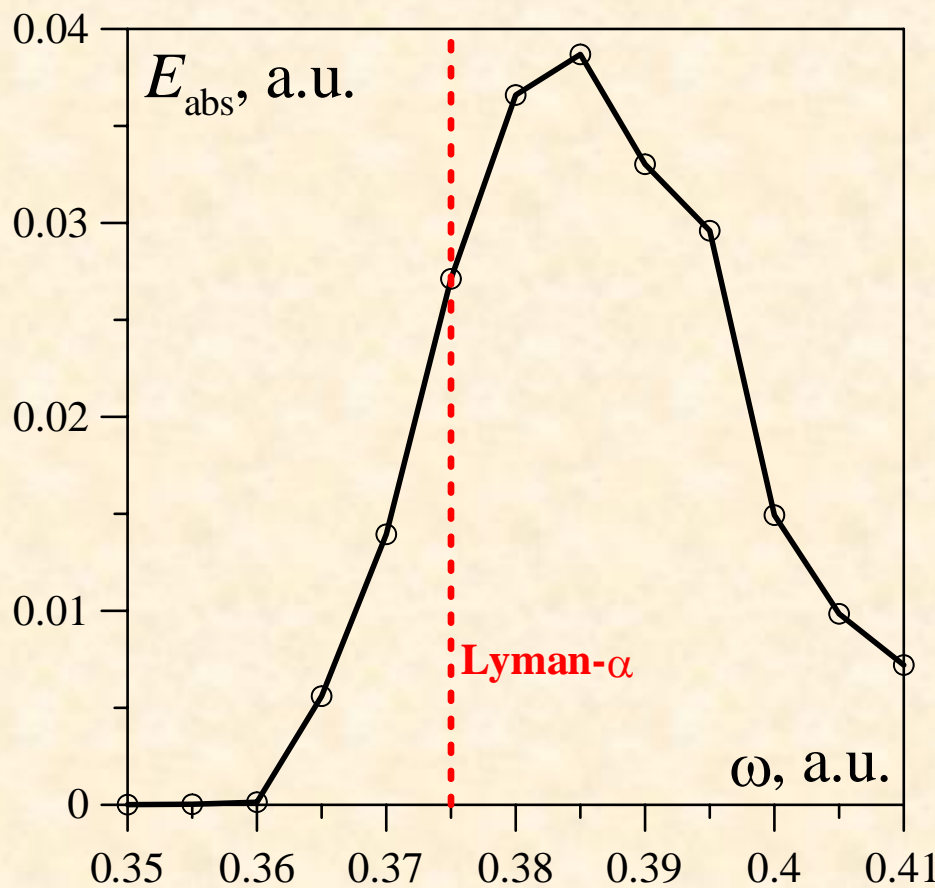
## Helium



# Excited states of Hydrogen represented by multiple Gaussian wave packets



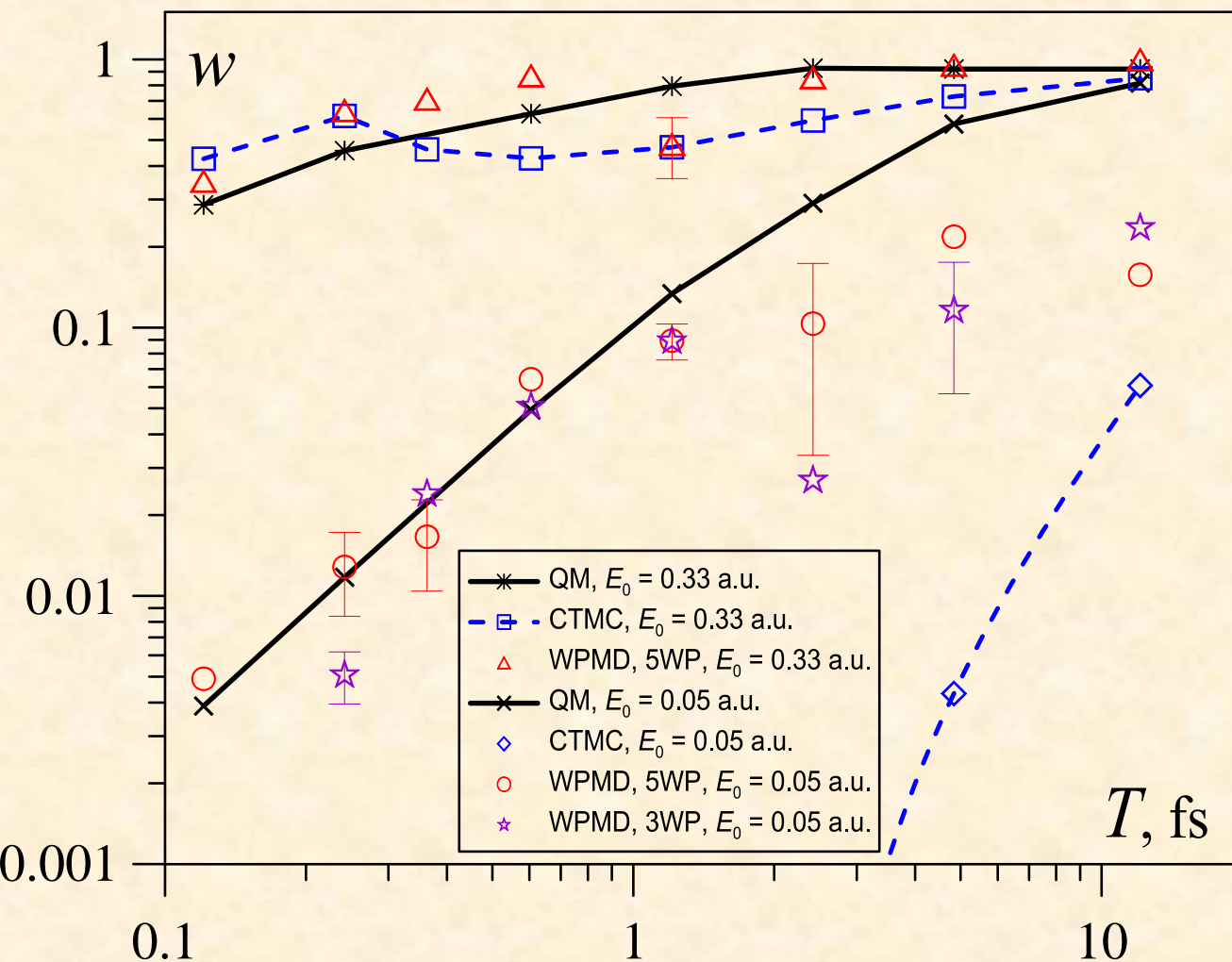
Spectrum of the time correlation function after excitation



Absorbed energy depending on the laser frequency in the area of  $1s \rightarrow 2s$  transition

$$N_{\text{wp}} = 5, T = 200 \text{ a.u.}, E_0 = 0.005 \text{ a.u.}$$

# Ionization of H(1s) atom by a laser pulse\*



**Classical Trajectory  
Monte-Carlo (CTMC):**

$$P = \frac{N_{E_{part} > 0}}{N_{tot}}$$

**WPMD**

**(1 electron, 3 WPs):**

$$\Psi = \Psi_{\text{bound}} + \Psi_{\text{free}}$$

$$P = \frac{\langle \Psi_{\text{free}} | \Psi_{\text{free}} \rangle}{\langle \Psi | \Psi \rangle}$$

\* Comparison with *J.P. Hansen, J. Lu, L.B. Madsen, H.M. Nilsen // Phys. Rev. A, 2001, V. 64, P. 033418.*

# Electron force field approach\*

$$E_{\text{elec-elec}} = \frac{1}{4\pi\epsilon_0} \sum_{i<j} \frac{1}{r_{ij}} \text{Erf} \left( \frac{\sqrt{2}r_{ij}}{\sqrt{s_i^2 + s_j^2}} \right),$$

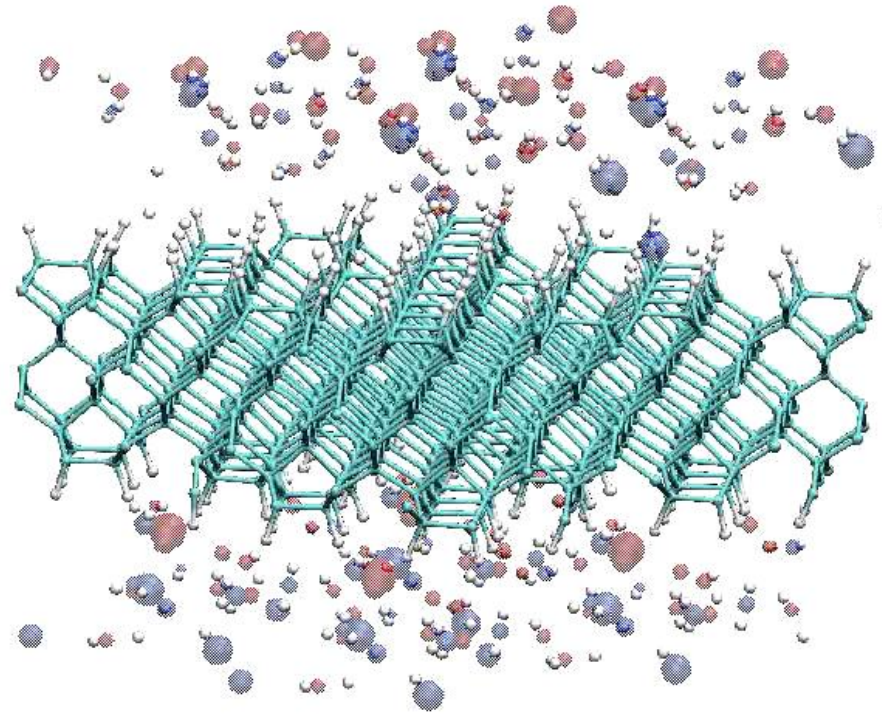
$$E_{\text{Pauli}} = \sum_{\sigma_i=\sigma_j} E(\uparrow\uparrow)_{ij} + \sum_{\sigma_i\neq\sigma_j} E(\uparrow\downarrow)_{ij},$$

$$E(\uparrow\uparrow)_{ij} = \left( \frac{S_{ij}^2}{1 - S_{ij}^2} + (1 - \rho) \frac{S_{ij}^2}{1 + S_{ij}^2} \right) \Delta T_{ij}$$

$$E(\uparrow\downarrow)_{ij} = \frac{\rho S_{ij}^2}{1 + S_{ij}^2} \Delta T_{ij},$$

$$\Delta T_{ij} = \frac{\hbar^2}{m_e} \left[ \frac{3}{6} \left( \frac{1}{\bar{s}_i^2} + \frac{1}{\bar{s}_j^2} \right) - \frac{6(\bar{s}_i^2 + \bar{s}_j^2) - 4\bar{r}_{ij}^2}{(\bar{s}_i^2 + \bar{s}_j^2)^2} \right], \quad S_{ij} = \left( \frac{2}{\bar{s}_i/\bar{s}_j + \bar{s}_j/\bar{s}_i} \right)^{3/2} e^{-\bar{r}_{ij}^2/(\bar{s}_i^2 + \bar{s}_j^2)},$$

$$\rho = -0.2, \quad \bar{x}_{ij} = x_{ij} \times 1.125, \quad \text{and} \quad \bar{s}_i = s_i \times 0.9.$$



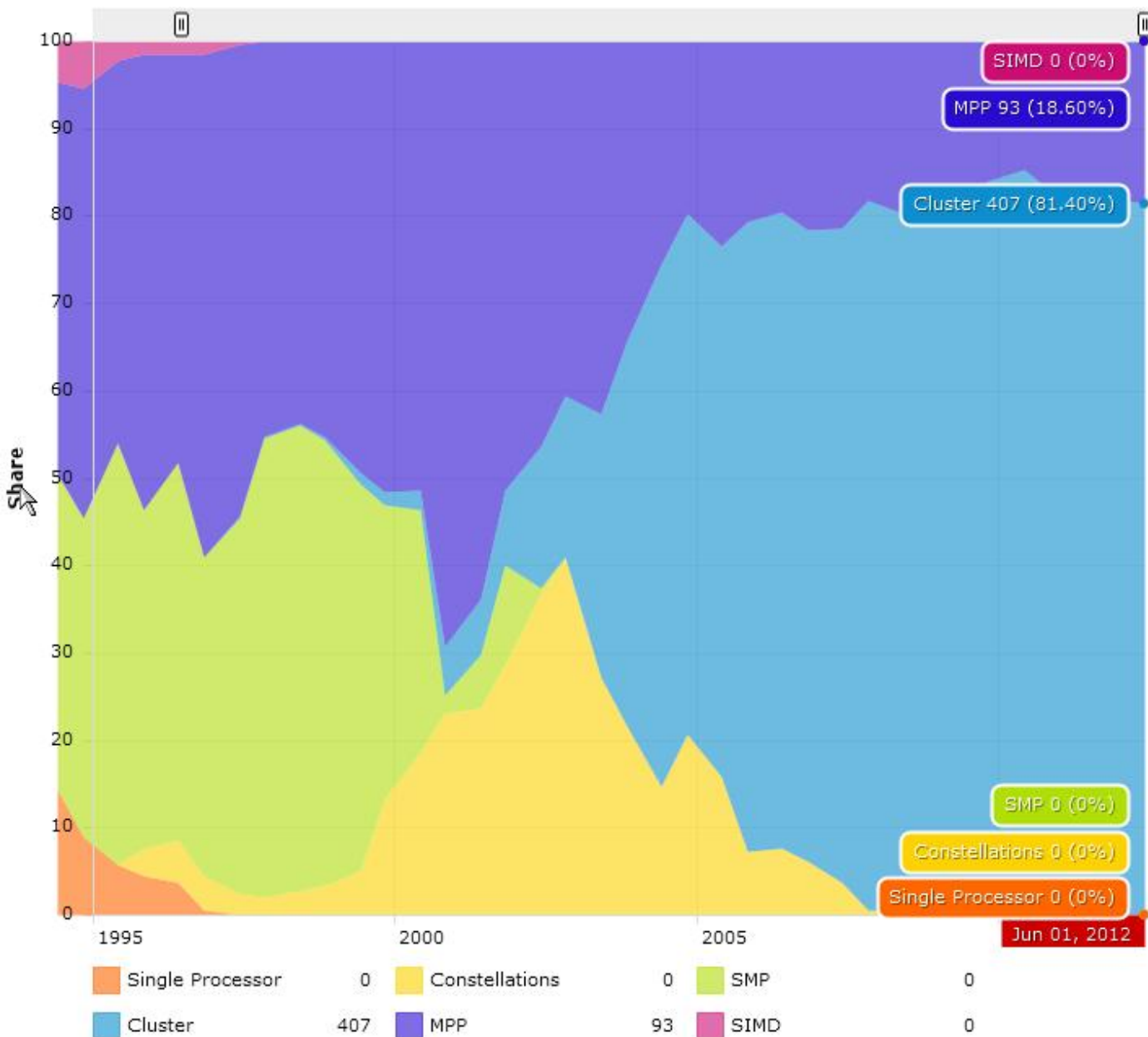
\* **J.T. Su, W.A. Goddard III**, *Excited Electron Dynamics Modeling of Warm Dense Matter*, Phys. Rev. Lett., 2007, v. 99, p. 185003.

# PARALLEL EXECUTION



*LLNL Sequoia  
Supercomputer*

# Top-500: System Architecture



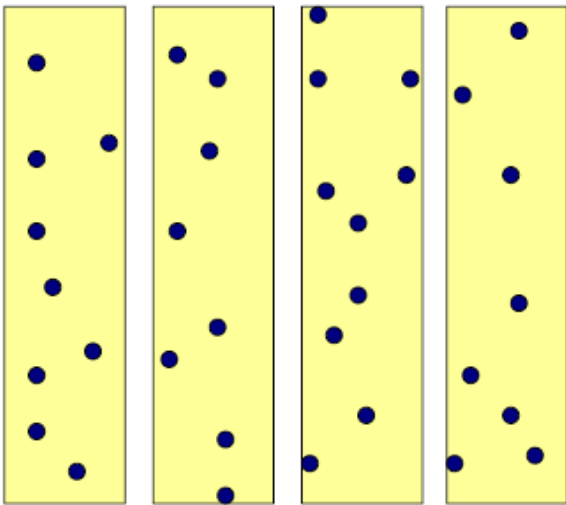


# Domain Decomposition

- Principle:**
- Distribute the spatial domain most uniform among processors
  - Particles can move across different processors
  - Only local communications required (interacting particles are on the local and neighbored processors)

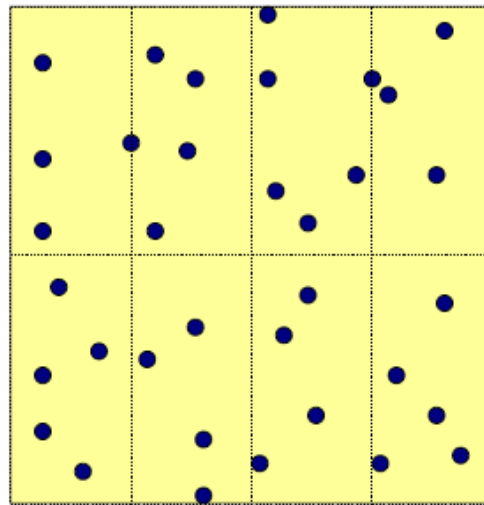
**slab-splitting**

PE 1   PE 2   PE 3   PE 4



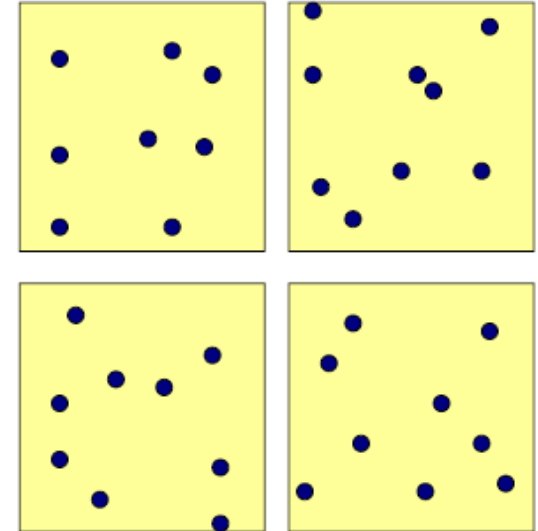
small number of neighbor cells:  
2 neighbors

whole system



**cube-splitting**

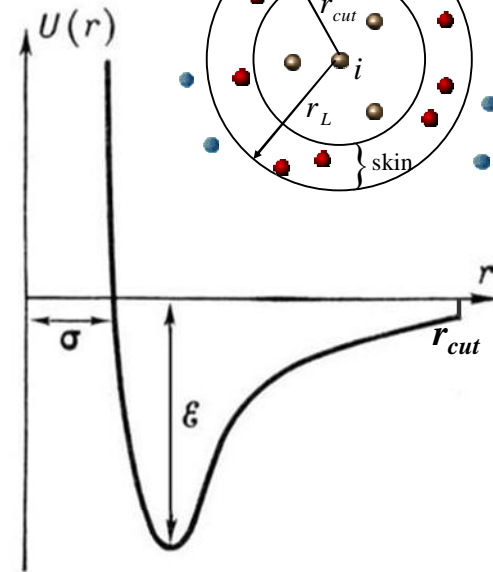
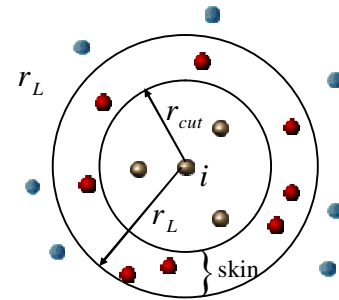
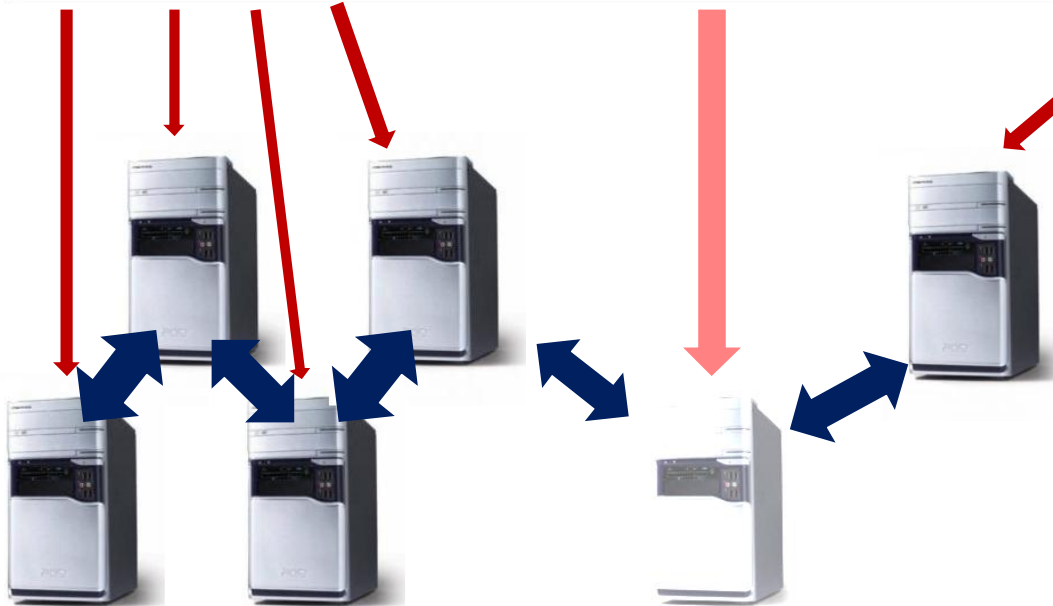
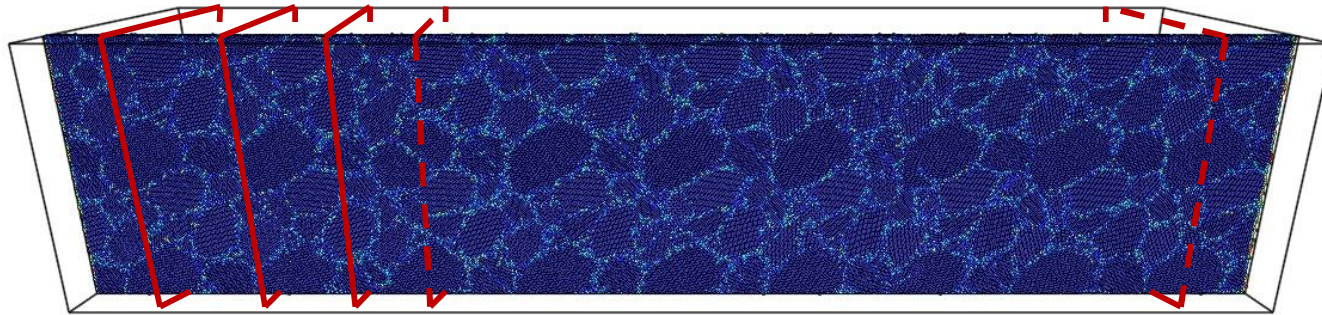
PE 1   PE 2



PE 3   PE 4

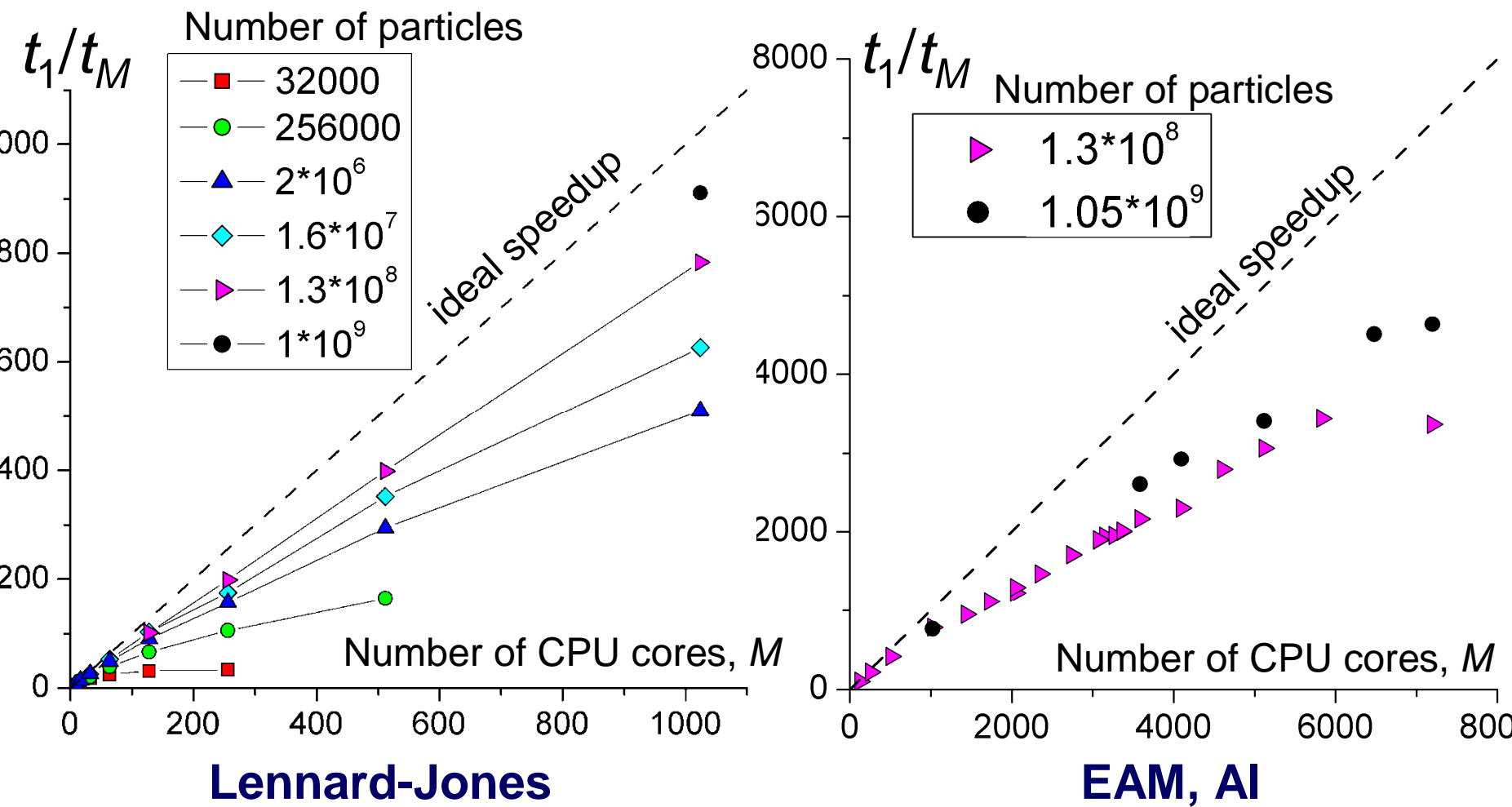
small surface area:  
8 / 26 neighbors (2-/3-dim)

# Domain decomposition



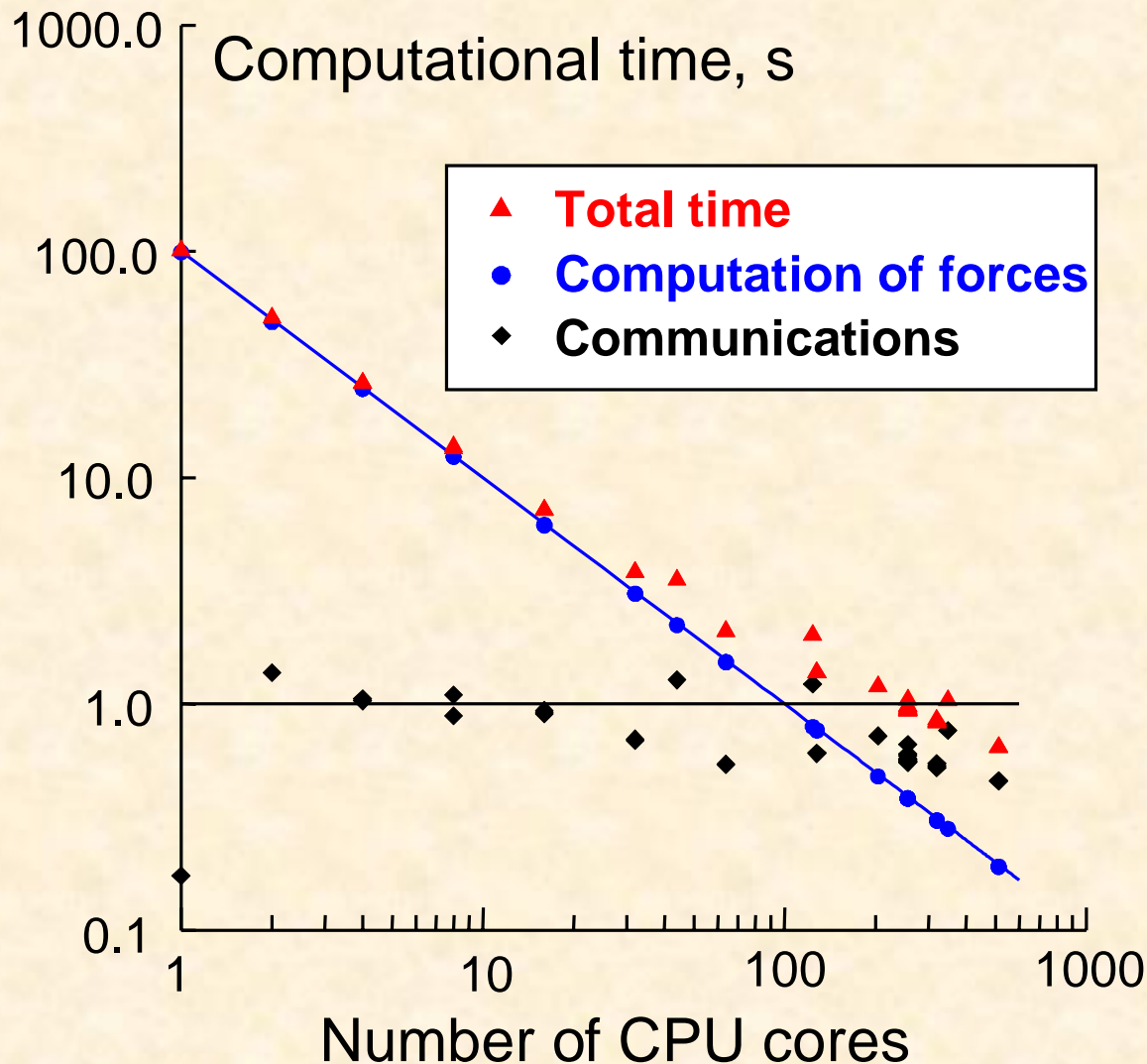
# Speedup depending on the number of CPU cores\*

*Simulations were performed at the MVS-100K cluster of JSCC RAS using LAMMPS*



\* A. Yu. Kuksin, G.E.Norman, V. V. Stegailov, and A. V. Yanilkin // Journal of Engineering Thermophysics, 2009, Vol. 18, No. 3, pp. 197–226.

# CPU number limit due to interprocess communications



The number of particles  
is fixed to  
 $N = 32\ 000$

Lennard-Jones  
interaction potential  
with large cut-off length  
 $R_{\text{cut}} = 7.0$

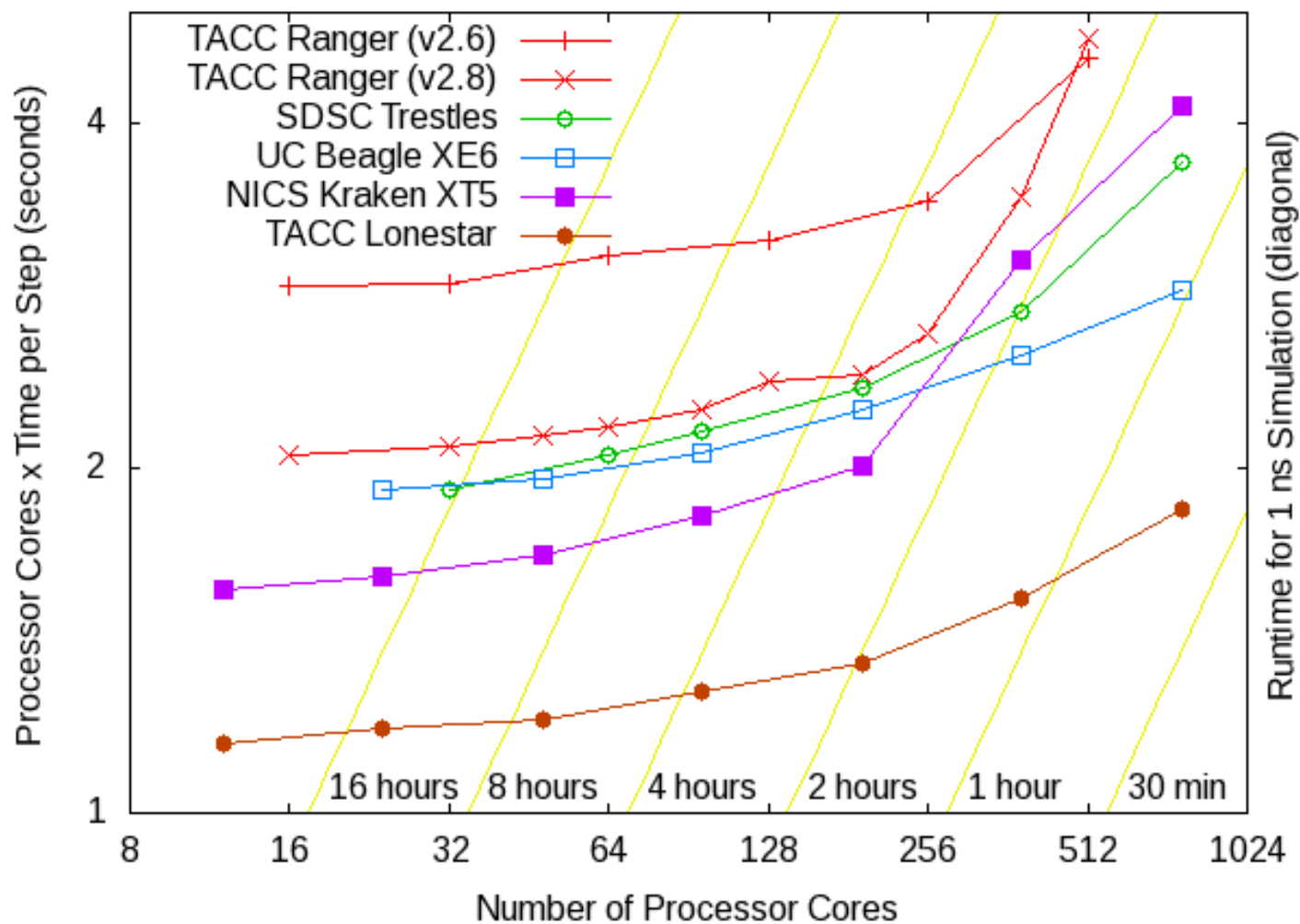
Computing cluster  
**MIPT-60**

Application  
**LAMMPS**

# NAMD: weak scaling for different clusters

92,224 atoms, 12A cutoff + PME every 4 steps, periodic

NAMD 2.8 ApoA1 Benchmark (92K atoms, PME)



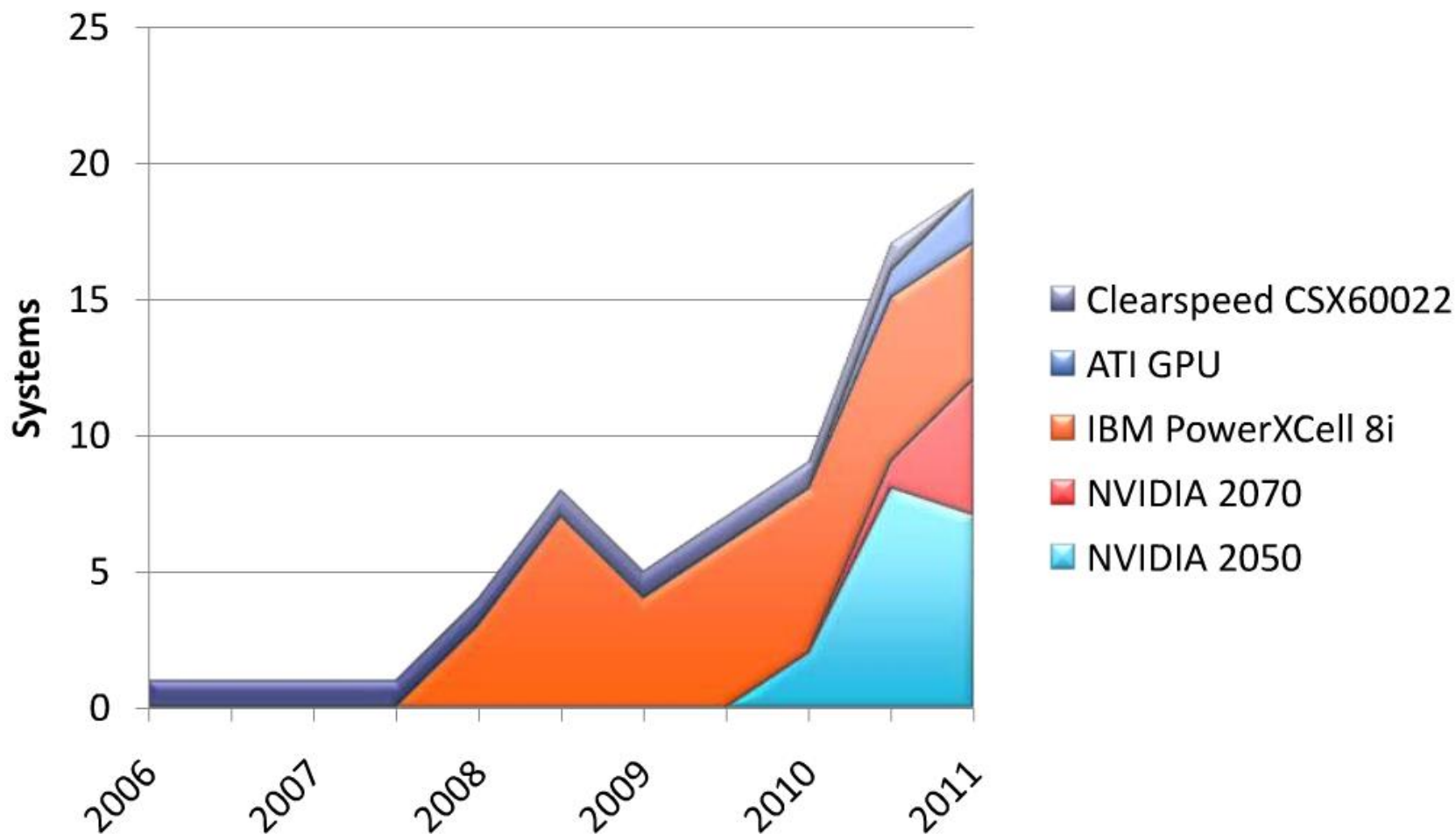


**ACCELERATION USING GPUs**

# Top 500 Supercomputers (June 2012)\*

Rank	Site	Computer/Year Vendor	Cores	R <sub>max</sub>	R <sub>peak</sub>	Power
1	DOE/NNSA/LLNL United States	<b>Sequoia</b> - BlueGene/Q, Power BQC 16C 1.60 GHz, Custom / 2011 IBM	1572864	16324.75	20132.66	7890.0
2	RIKEN Advanced Institute for Computational Science (AICS) Japan	<b>K computer</b> , SPARC64 VIIIfx 2.0GHz, Tofu interconnect / 2011 Fujitsu	705024	10510.00	11280.38	12659.9
3	DOE/SC/Argonne National Laboratory United States	<b>Mira</b> - BlueGene/Q, Power BQC 16C 1.60GHz, Custom / 2012 IBM	786432	8162.38	10066.33	3945.0
4	Leibniz Rechenzentrum Germany	<b>SuperMUC</b> - iDataPlex DX360M4, Xeon E5-2680 8C 2.70GHz, Infiniband FDR / 2012 IBM	147456	2897.00	3185.05	3422.7
5	National Supercomputing Center in Tianjin China	<b>Tianhe-1A</b> - NUDT YH MPP, Xeon X5670 6C 2.93 GHz, NVIDIA 2050 / 2010 NUDT	186368	2566.00	4701.00	4040.0
6	DOE/SC/Oak Ridge National Laboratory United States	<b>Jaguar</b> - Cray XK6, Opteron 6274 16C 2.200GHz, Cray Gemini interconnect, NVIDIA 2090 / 2009 Cray Inc.	298592	1941.00	2627.61	5142.0
7	CINECA Italy	<b>Fermi</b> - BlueGene/Q, Power BQC 16C 1.60GHz, Custom / 2012 IBM	163840	1725.49	2097.15	821.9
8	Forschungszentrum Juelich (FZJ) Germany	<b>JuQUEEN</b> - BlueGene/Q, Power BQC 16C 1.60GHz, Custom / 2012 IBM	131072	1380.39	1677.72	657.5
9	CEA/TGCC-GENCI France	<b>Curie thin nodes</b> - Bullx B510, Xeon E5-2680 8C 2.700GHz, Infiniband QDR / 2012 Bull	77184	1359.00	1667.17	2251.0
10	National Supercomputing Centre in Shenzhen (NSCS) China	<b>Nebulae</b> - Dawning TC3600 Blade System, Xeon X5650 6C 2.66GHz, Infiniband QDR, NVIDIA 2050 / 2010 Dawning	120640	1271.00	2984.30	2580.0

# Accelerators in supercomputers



Источник: Top500.org

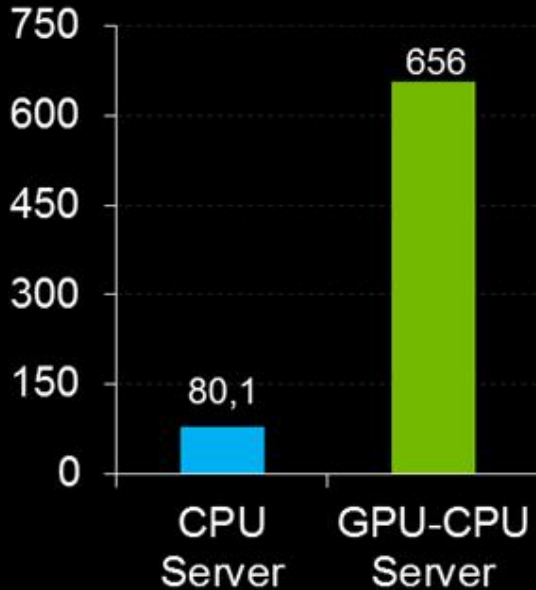
Горбас С.А., XIII Международная суперкомпьютерная конференция

«Научный сервис в сети интернет: экзафлопсное будущее», 14-24 сентября 2011г.

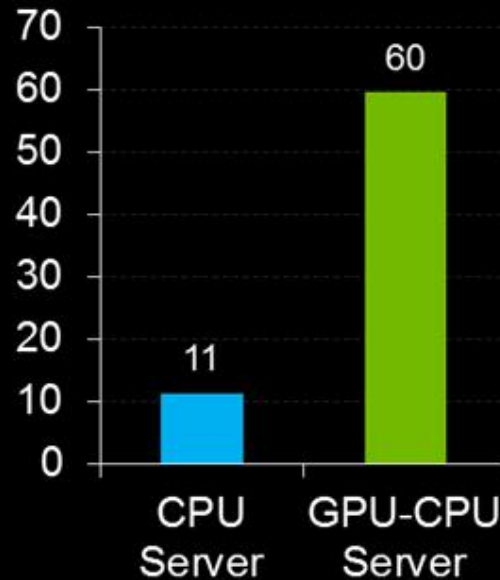


# GPU vs CPU: Performance, Cost, Energy Saving\*

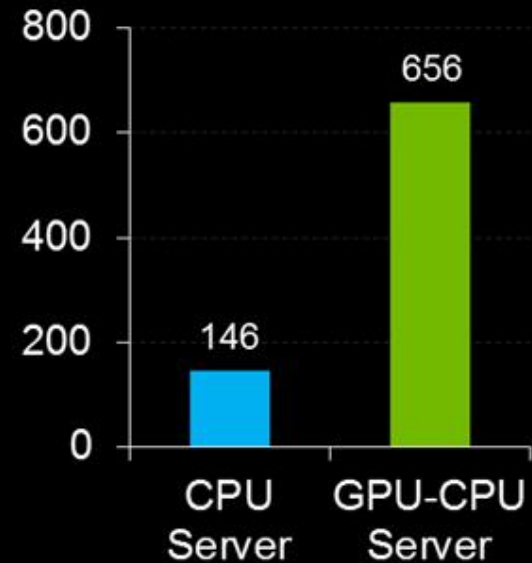
Linpack performance,  
GFlops



GFlops/\$K



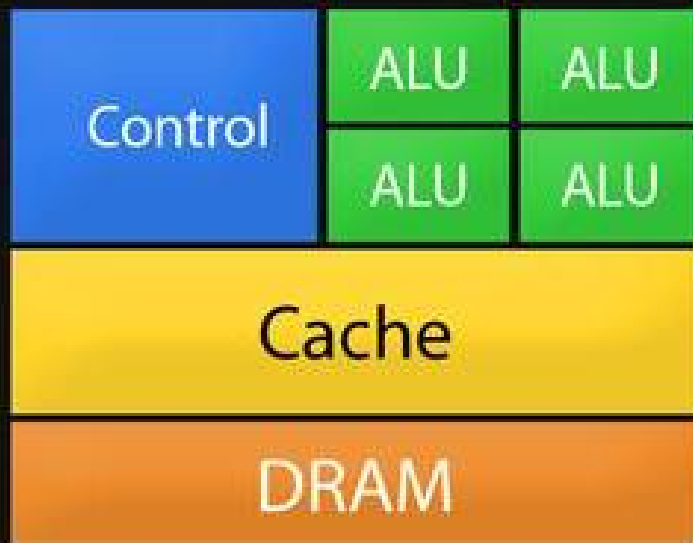
GFlops/KW



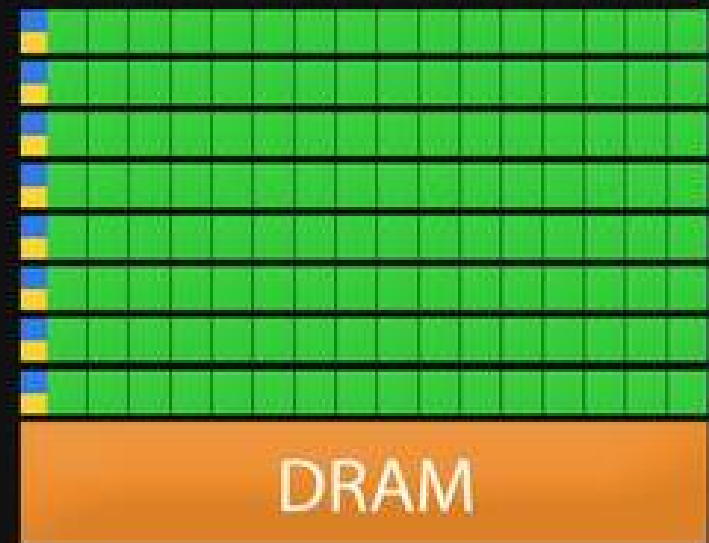
**CPU 1U Server:** 2x Intel Xeon X5550 (Nehalem) 2.66 GHz, 48 GB memory, \$7K, 0.55 kw

**GPU-CPU 1U Server:** 2x Tesla C2050 + 2x Intel Xeon X5550, 48 GB memory, \$11K, 1.0 kw

# Comparison of CPU and GPU architectures\*



CPU



GPU

# GPU-enabled MD simulation packages

## LAMMPS

### Large-scale Atomic/Molecular Massively Parallel Simulator

Sandia National Lab, USA

<http://lammps.sandia.gov>, Free.



### Highly Optimized Object Oriented Molecular Dynamics

Developers: J.A. Anderson, A. Travesset  
Iowa State University, Ames, IA 50011, USA

<http://codeblue.umich.edu/hoomd-blue/>, Free.



## NAMD/VMD

University of Illinois at Urbana-Champaign  
(UIUC), USA

<http://www.ks.uiuc.edu/Research/namd>, Free.

GROMACS +



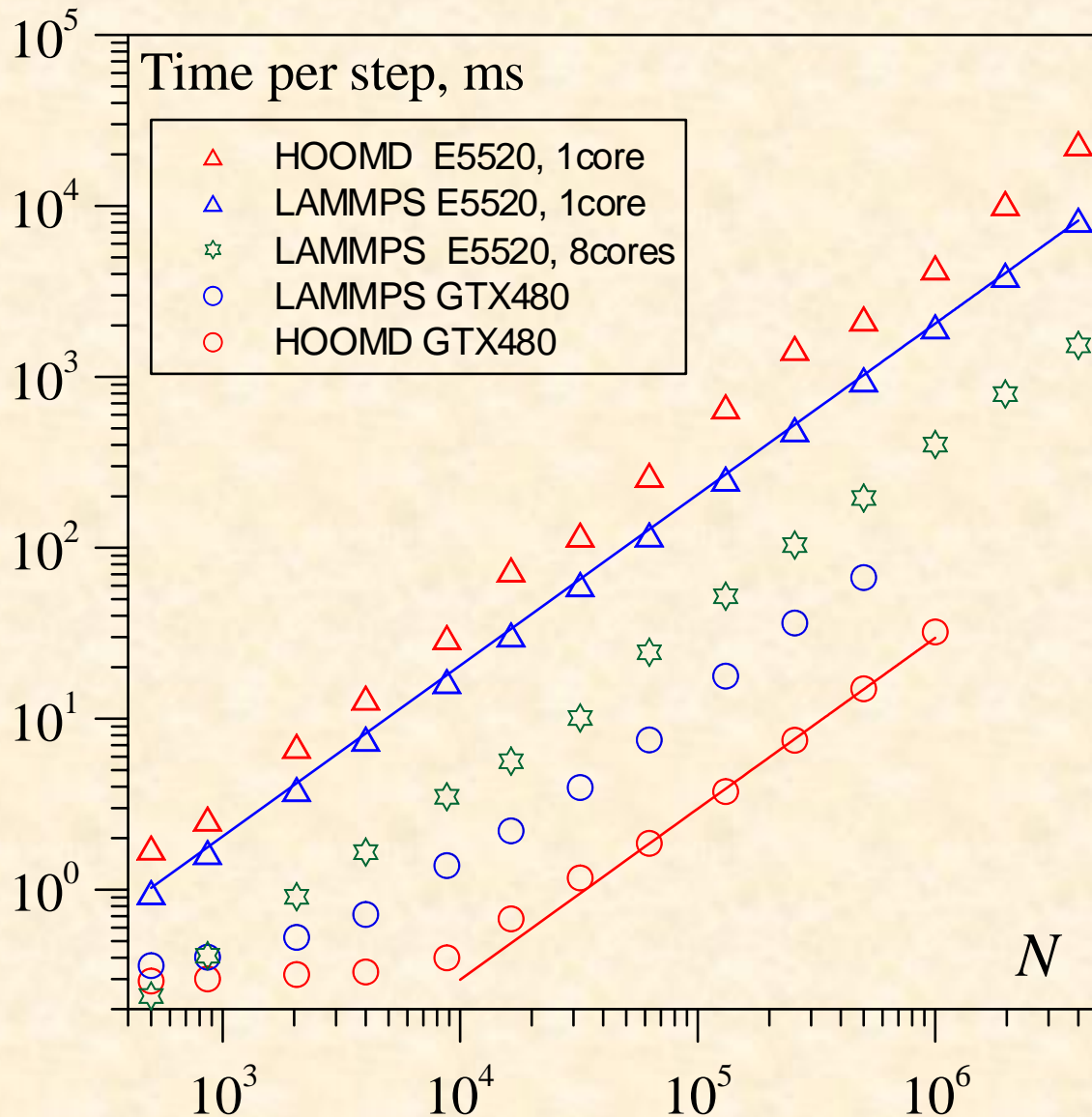
MDGPU

AMBER

ACE-MD

HALMD

# Time of a single step execution (the lower the better) for different number of particles



## Benchmarks for Lennard-Jones liquid:

$$\rho = 0.84, T = 0.64,$$
$$r_{cut} = 3, r_{skin} = 0.8$$

## MD simulation packages:

LAMMPS (18 Feb 2011)

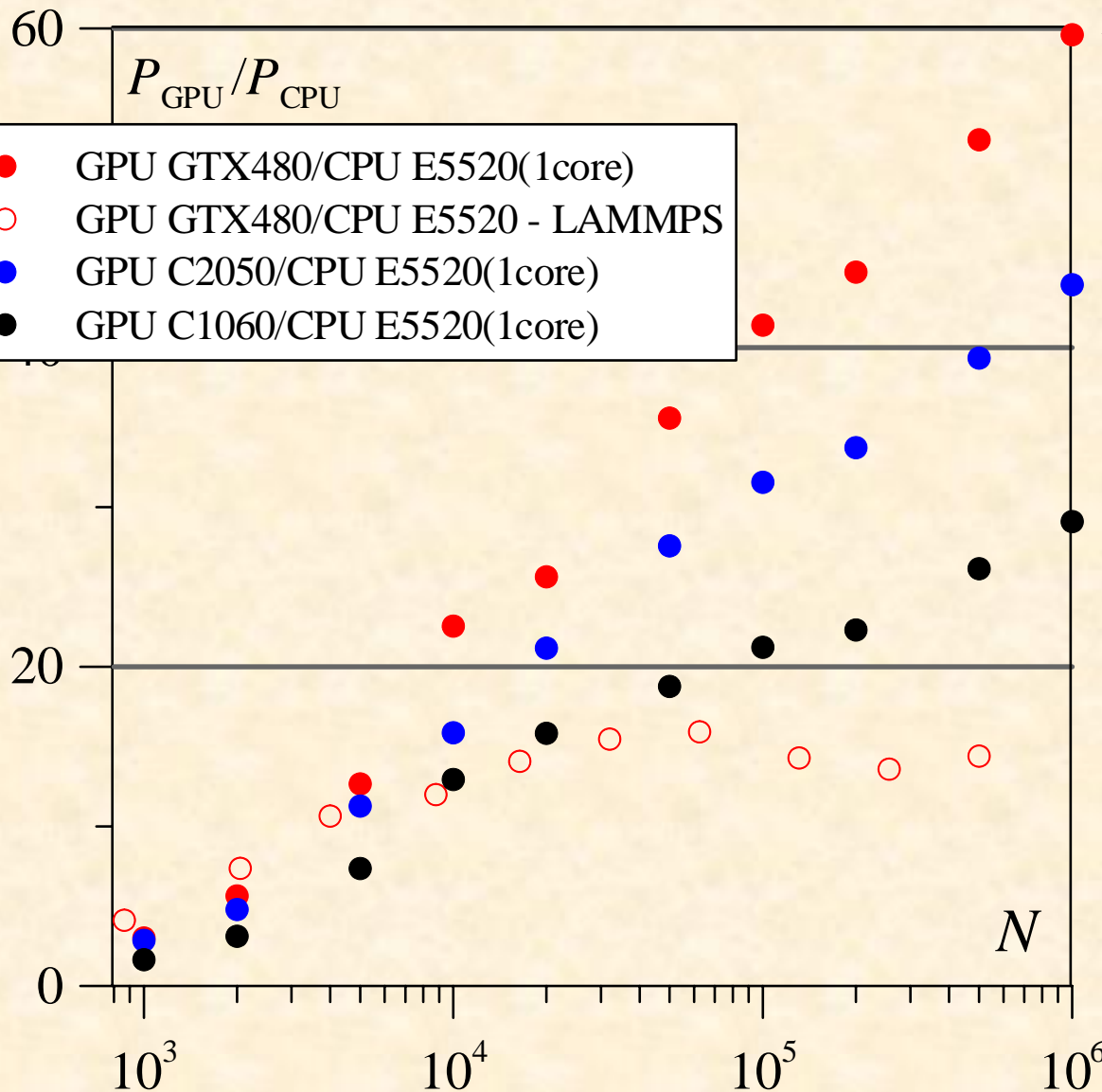
HOOMD ver. 0.9.1

## Compilers:

icc 11.0 20090318

CUDA 3.2, V0.2.1221

# Ratio between GPU and CPU performances depending on the number of particles



60 X

**Benchmarks for  
Lennard-Jones  
liquid:**

$$\rho = 0.19, T=1.0,$$

$$r_{\text{cut}} = 3, r_{\text{skin}} = 0.8$$

**MD simulation  
packages:**

LAMMPS (20 May 2010)

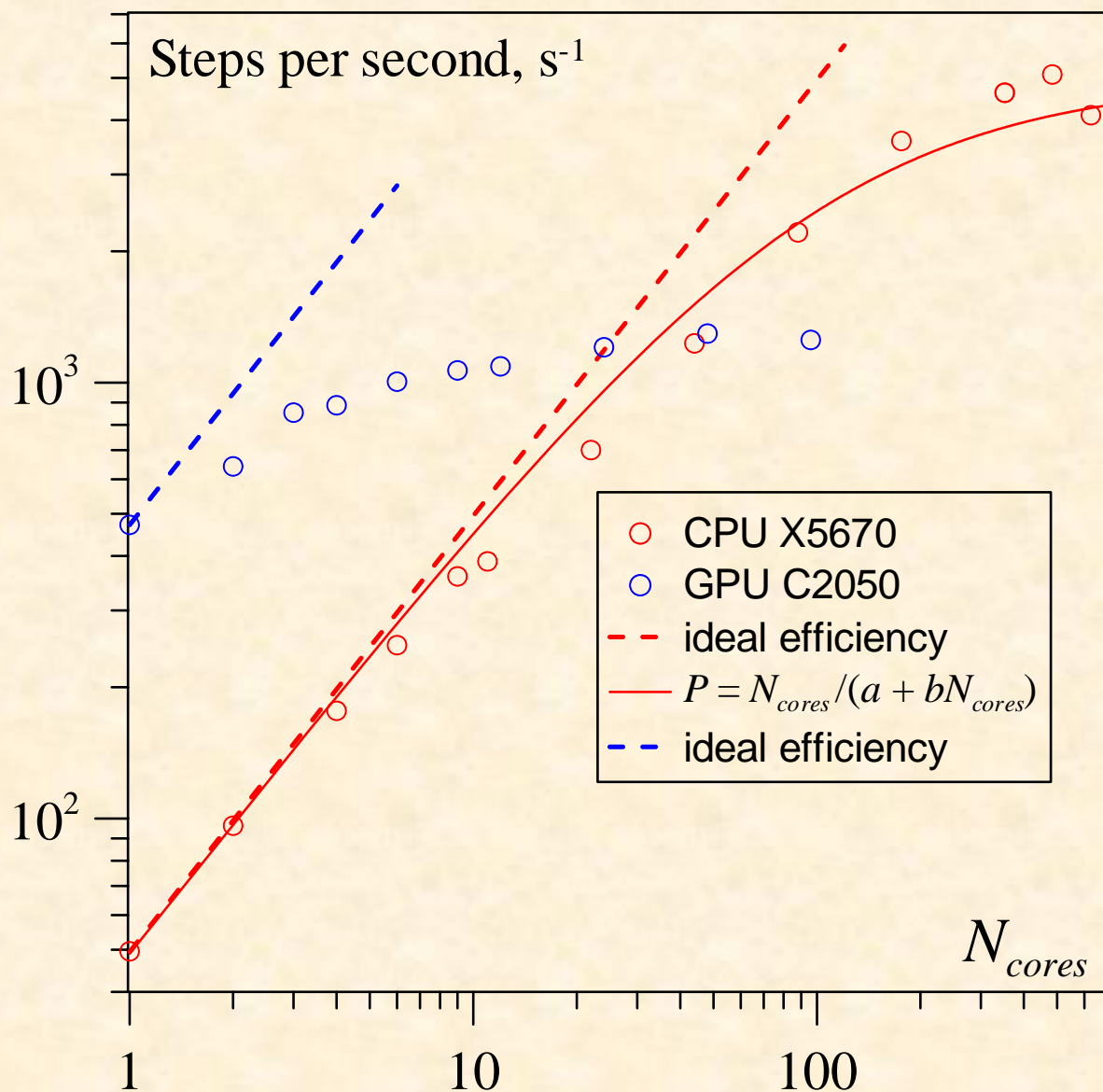
HOOMD ver. 0.9.0

**Compilers:**

icc 11.0 20090318

CUDA 3.2, V0.2.1221

# Time of a single step execution for different number of CPU/GPU cores of the hybrid cluster



$$N_{part} = 16 \cdot 10^3$$

**Benchmarks for  
LJ liquid:**

$$\rho = 0.19, T = 1.0,$$
$$r_{cut} = 3, r_{skin} = 0.8$$

**MD simulation  
packages:**

LAMMPS (5 Apr 2011)

**Compilers:**

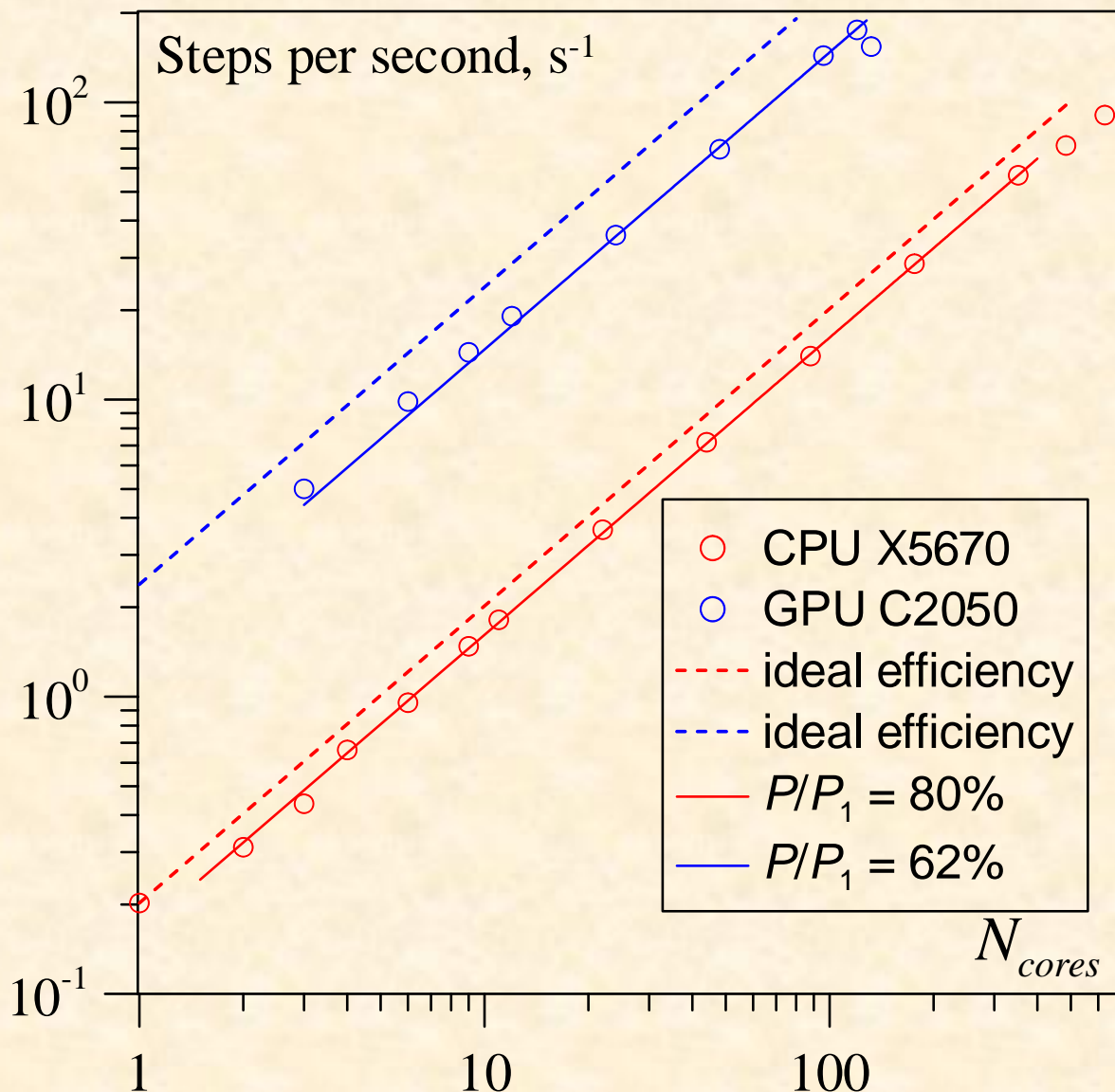
icc 11.1 20100414

CUDA 3.2, V0.2.1221

**Cluster:**

K100 (KIAM RAS)

# Time of a single step execution for different number of CPU/GPU cores of the hybrid cluster



$$N_{part} = 4 \cdot 10^6$$

**Benchmarks for  
LJ liquid:**

$$\rho = 0.19, T = 1.0,$$

$$r_{cut} = 3, r_{skin} = 0.8$$

**MD simulation  
packages:**

LAMMPS (5 Apr 2011)

**Compilers:**

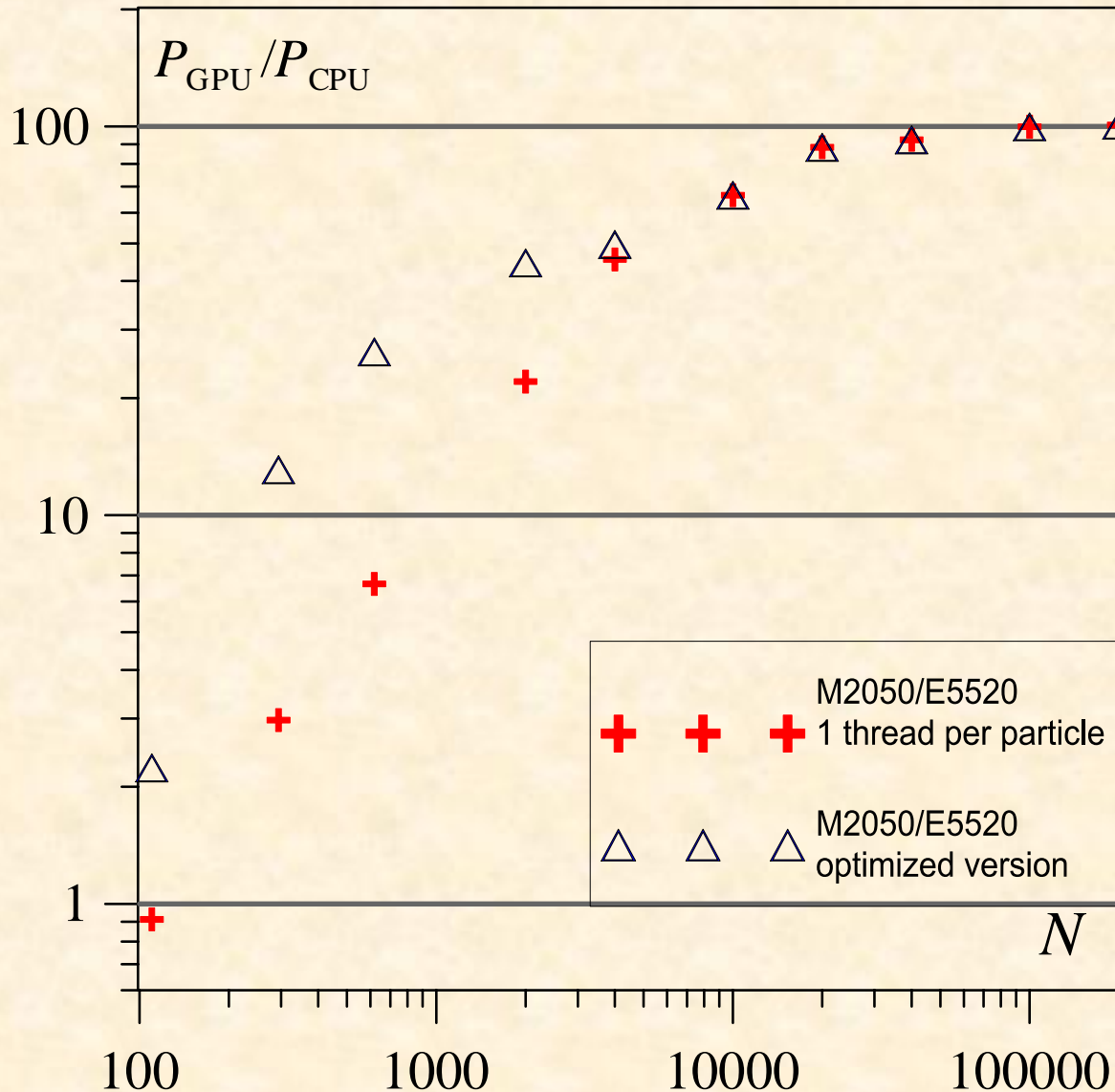
icc 11.1 20100414

CUDA 3.2, V0.2.1221

**Cluster:**

K100 (KIAM RAS)

# Ratio between GPU and CPU performances depending on the number of particles



← **100 X**

**GPU:**

NVIDIA Tesla M2050  
CUDA 4.0, V0.2.1221

**CPU:**

Xeon E5520  
(Nehalem),  
2.27GHz, 8Mb L3  
Intel compiler  
ver. 11.0.083

**Interactions:**

Coulomb  
(long-range)

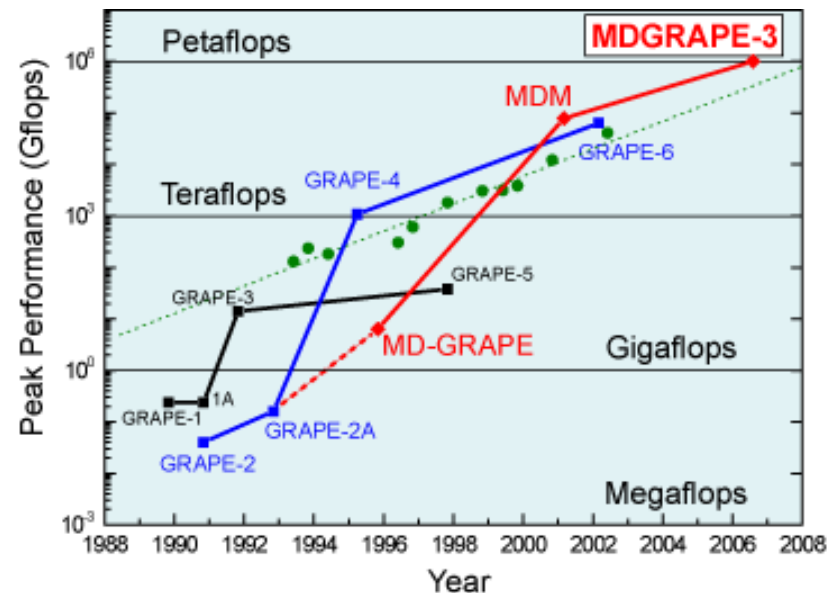


# RIKEN “Protein Explorer”: special purpose system for molecular dynamics



1 unit = Dual-core Intel Xeon CPU  
+  
24 MD-GRAPE chips

**201 units achieve 1 PFlops for MD**





# ATOMISTIC SIMULATIONS ON THE GRID

# Requirements to Grid middleware

**MD (or MC) numerical experiment usually goes through a number of stages:**

Low level:

- prepare system in the initial state
- propagate it through the chain of other states
- obtain system properties from the MD trajectory



***need for  
workflow***

High level:

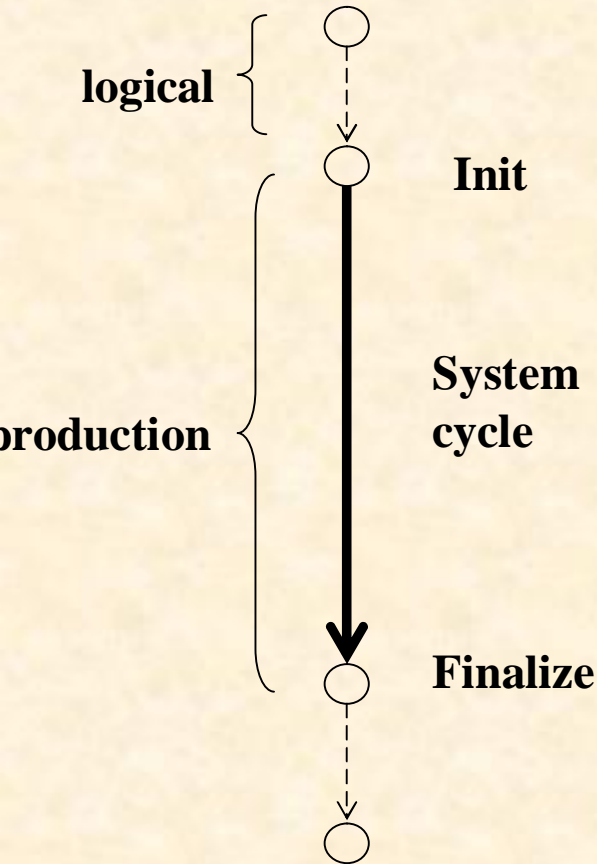
- average over a set of initial states
  - perform parameter sweep
  - perform optimal parameter search
- etc*



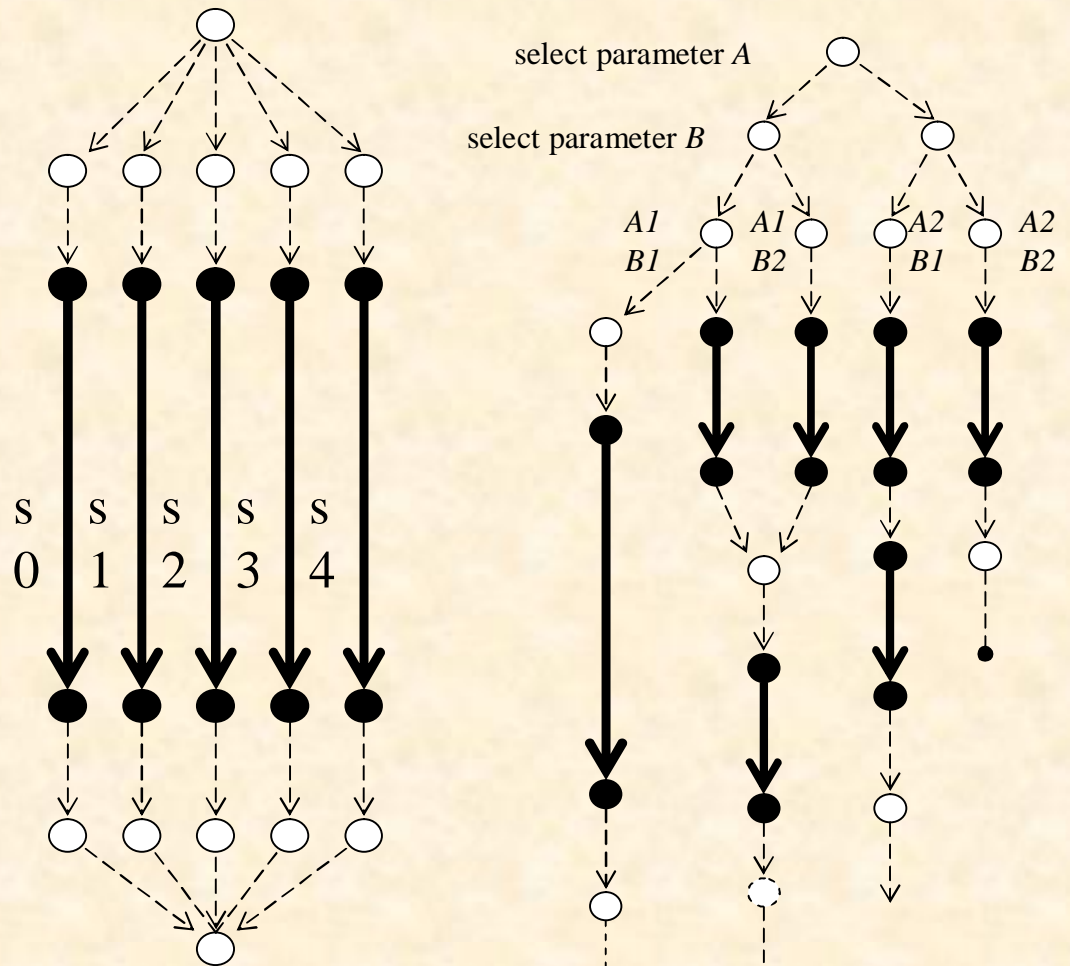
***need for  
predefined  
workflow  
scenarios***

# Scenarios and workflow graphs

## Graph elements



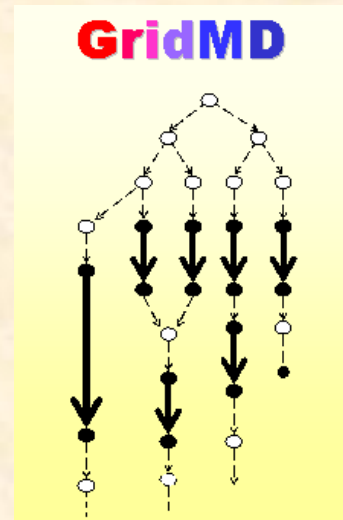
## Scenario examples



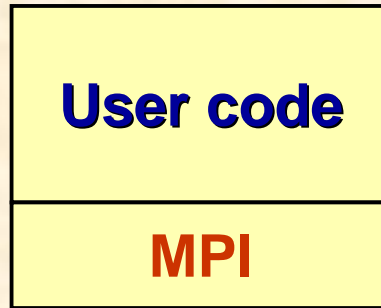
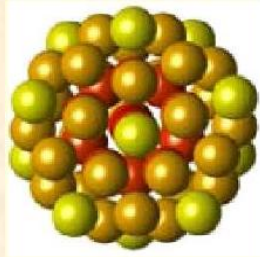
# Open source GridMD library

*GridMD is a C++ class library intended for constructing simulation applications and running them in distributed environments*

- **Single application** for serial (debug) and distributed execution
- Automatic workflow generation from **GridMD function calls** inside the main application
- Component architecture, easy interfacing to **other MD packages**.
- All required **components for MD experiment**: boundary conditions, thermodynamic ensembles, etc.)
- Support for various **job managers**
- **Cross-platform** design, compiled for Linux and Windows
- **Open source** code (available at <http://gridmd.sourceforge.net>)



# Submission of the tasks to parallel and distributed systems



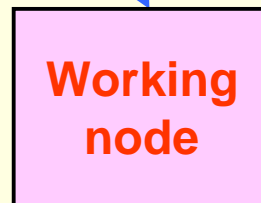
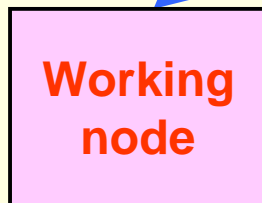
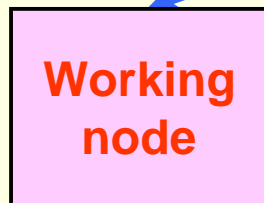
*Simulation program*

local shell, ssh, Globus, etc

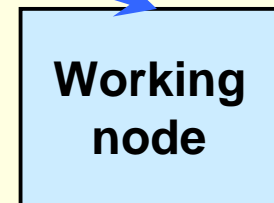
**Batch system (PBS, ...)**



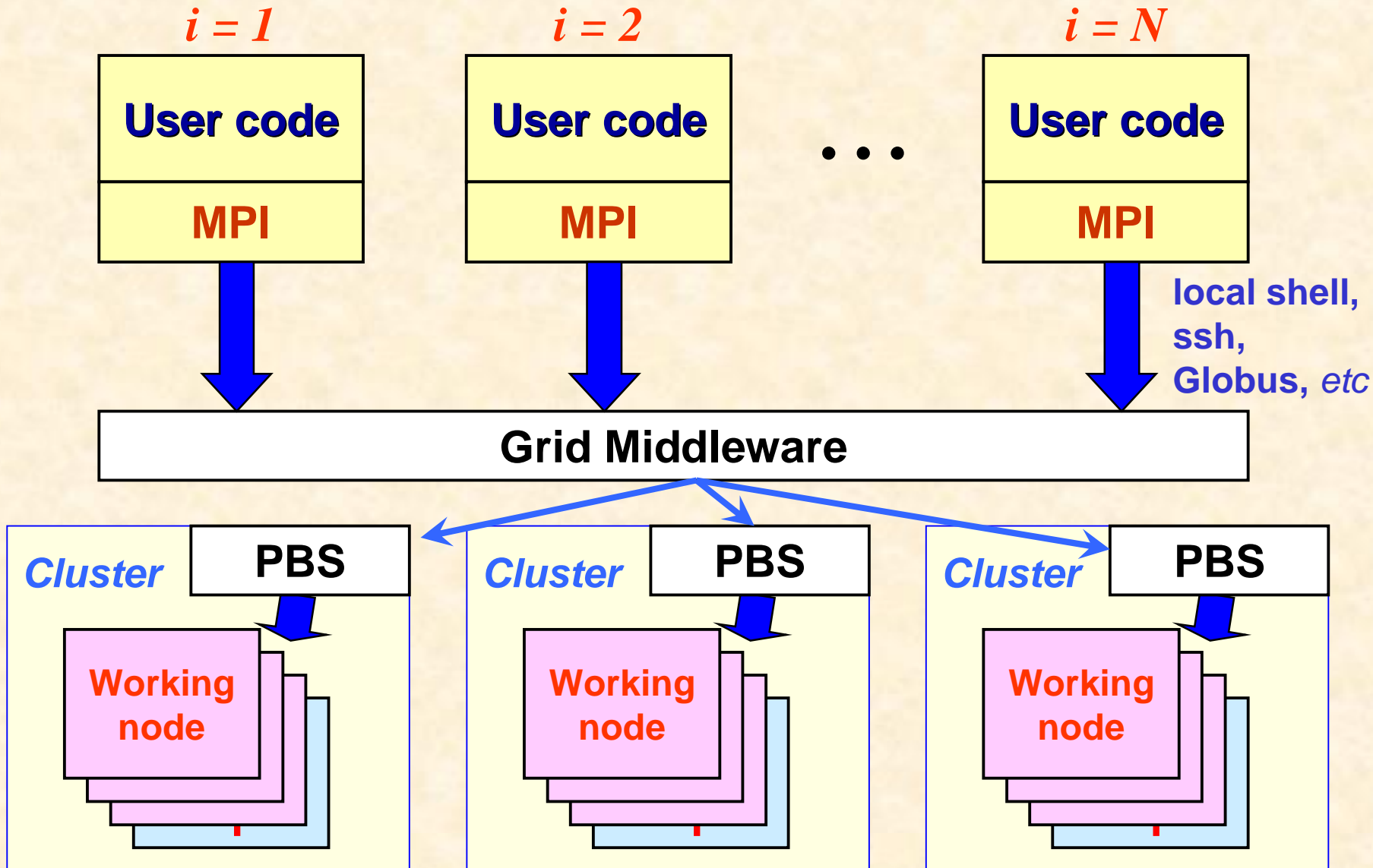
*Cluster*



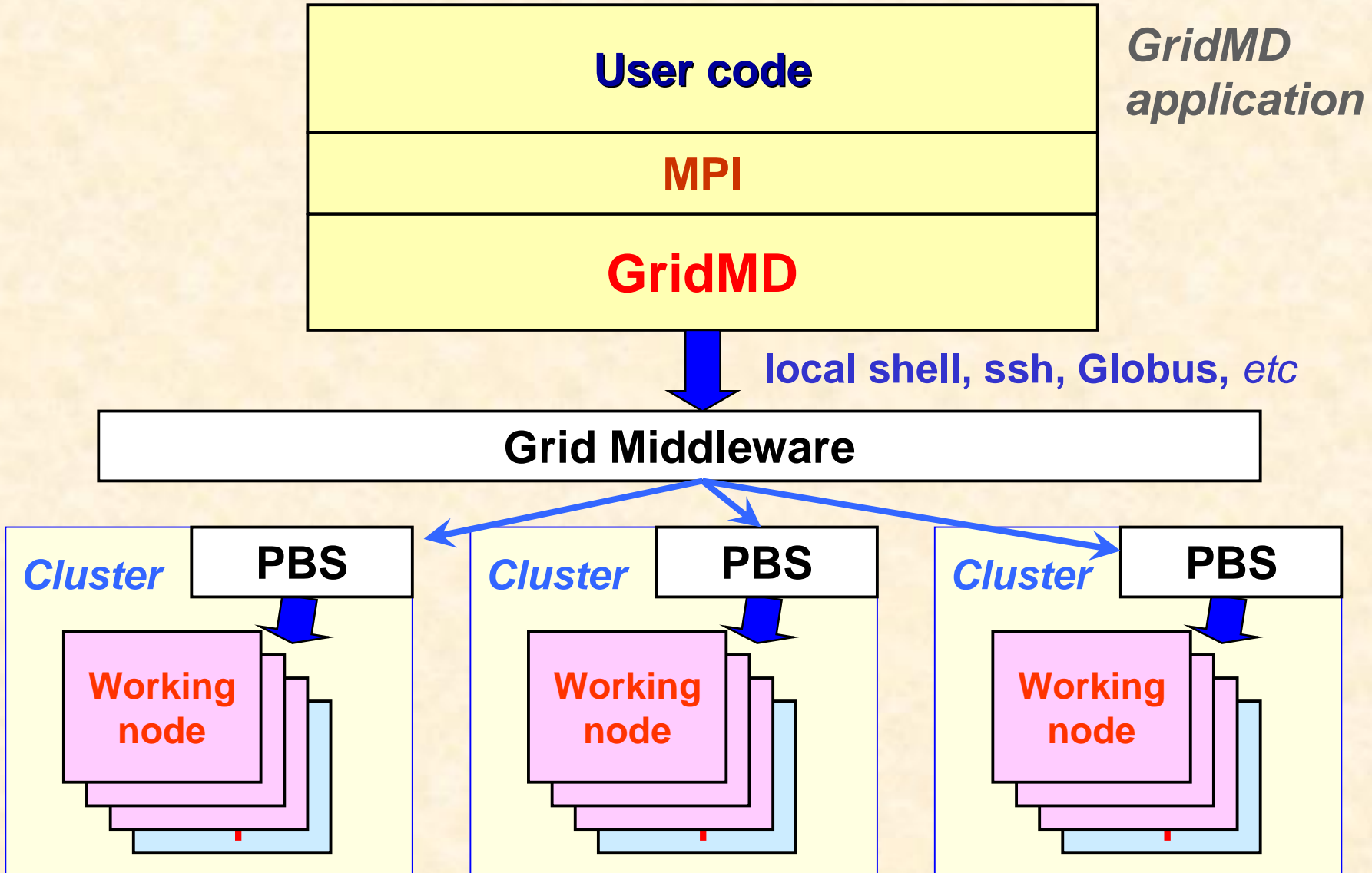
...



# Submission of the tasks to parallel and distributed systems

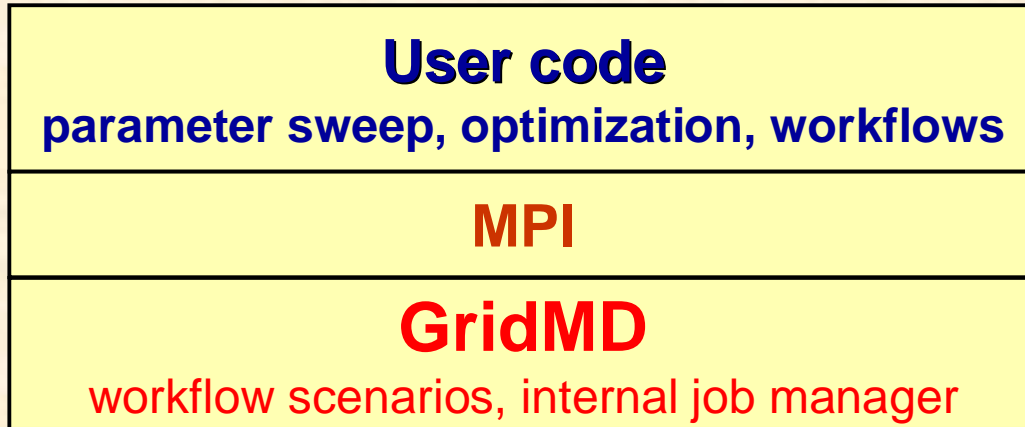


# Submission of the tasks to parallel and distributed systems



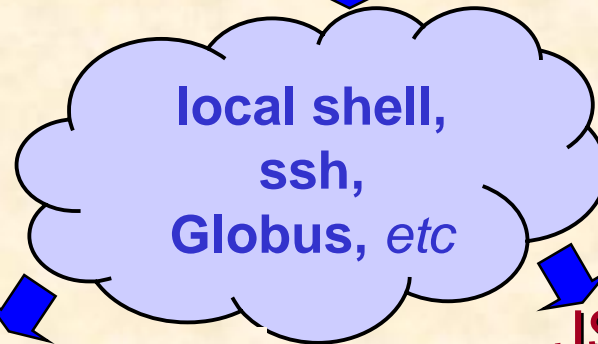


# Submission of the tasks to parallel and distributed systems



*GridMD application*

**Nimrod workflows**



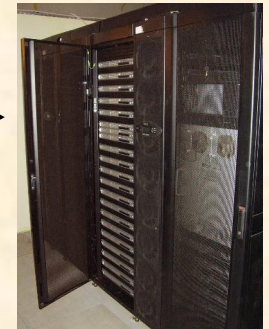
**DEISA Shell**



**JSCC RAS**



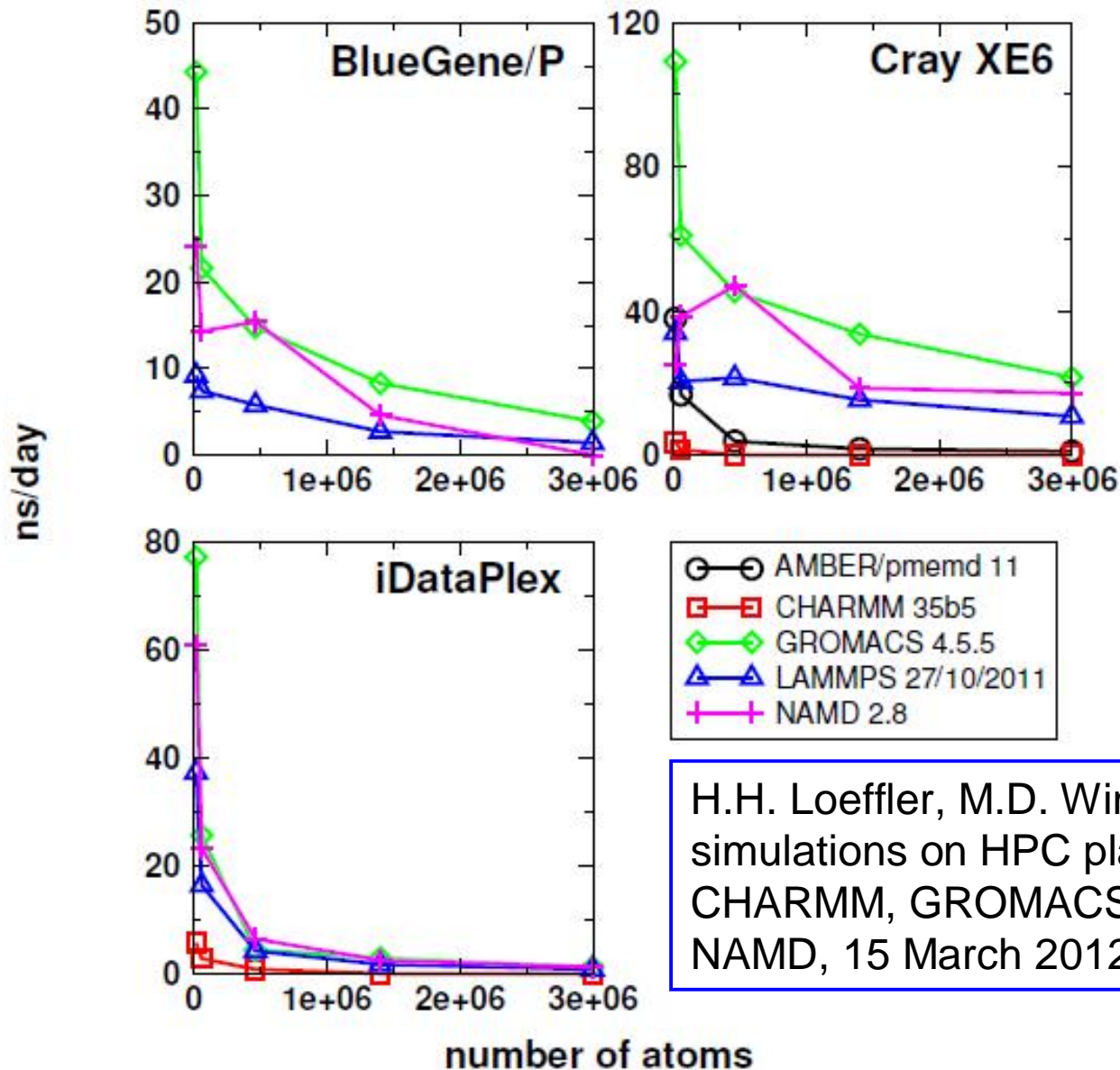
**PBS**



# Open source packages for atomistic simulations

Package name	Language	GPU	Parallel	Min	MD	MC	Comment
<b>Adun</b>	C			+	+		User specified force field (FFML), QM/MM calculations with Empirical Valence Bond (EVB)
<b>DL_POLY*</b>	Fortran, C++, Java				+		General purpose MD, HDF5 output, Java GUI
<b>GROMACS</b>	C	+	MPI		+		High performance MD, designed for biological systems and polymers
<b>HALMD</b>	C++	++			+		High-precision MD for the large-scale simulation of simple and complex liquids, HDF5 output
<b>HOOMD-blue</b>	C++, Python	++		+	+		General-purpose MD highly optimized for GPUs
<b>LAMMPS</b>	C++	+	MPI	+	+	+	High parallel scalability, wide range of potentials and analysis tools
<b>MDynaMix</b>	Fortran		MPI		+		Parallel MD for AMBER force field
<b>MOIL</b>	Fortran, Tcl		MPI	+	+		Basic algorithms and force fields, Replica exchange, coarse-grained models, Tcl GUI
<b>NAMD/VMD</b>	C++	+	MPI				High parallel scalability, designed for biomolecular, visualization (VMD)
<b>RedMD</b>	C/C++	-		+	+	+	Coarse-grained models of proteins and nucleic acids
<b>TINKER</b>	Fortran		OpenMP	+	+	+	Simple MD, QM/MM, molecular design
<b>XMD</b>	C		pthreads	+	+	+	MD for metals and ceramics

# Benchmarks for bimolecular simulations



H.H. Loeffler, M.D. Winn, Large biomolecular simulations on HPC platforms: III. AMBER, CHARMM, GROMACS, LAMMPS and NAMD, 15 March 2012

# CONCLUSIONS

- Open source projects are particularly suitable for scientific research because they are customizable, extensible, implement a variety of ionization models and optimization techniques.
- Quasiclassical atomistic simulations of chemical reactions, ionization/recombination processes and electron-ion relaxation are still a challenge.
- GPUs can highly accelerate MD simulations in particular for long-ranged interactions.
- Averaging and parameter sweep lead allow to run simulations on Grid and Cloud environments.

Our web site: <http://www.ihed.ras.ru/norman>