# Computational Physics

Lecture 1

#### Organisation of the course - 2 versions

#### 3 ECTS course

6 weeks - 1 project:

 Molecular Dynamics simulation of different phases of matter

#### 6 ECTS course

12 weeks - 3 projects:

- Molecular Dynamics simulation of different phases of matter (6 weeks)
- Monte-Carlo simulation of the lsing model (3 weeks)
- Individual projects (3 weeks)

#### Organisation of the course - Lectures

- Fridays 11:00 in HL111.
- Detailed schedule of topics on *Brightspace*.
- Lecture ~20-40 min then time for coding the weekly milestones, running simulations and analysing them.
- Teaching team will be there too to answer questions and help with the coding aspects.

# Organisation of the course - Marking

- Project-based assessment.
- Projects done in teams of 2 people. 1 report per team.
  - → Please register your teams on *Brightspace*.
- Grading based on the simulation code (30%) and report (70%).
- The final 10% of a project are obtained by completing unguided extensions.
- Specific guidelines for each project will be put on Brightspace in due course.

#### Organisation of the course - Team

Two teaching assistants here to help:

- Eloic Vallee (<u>vallee@lorentz.leidenuniv.nl</u>)
- Orestis Karapiperis (<u>karapiperis@lorentz.leidenuniv.nl</u>)

There will be a TA hour organised. Check your *Brightspace* announcements.

## Organisation of the course - Books

If you want to go beyond the course, this textbook is recommended:

J.M. Thijssen, Computational physics, Cambridge University Press, 2007

Or the classic:

W. Press, *Numerical Recipes in C++*, *The Art of Scientific Computing*, 2nd Edition, Cambridge University Press, 2002

# Organisation of the course - Programming

- Language of choice: python3
- Only basic knowledge required.
   Nothing beyond what was covered in your 1<sup>st</sup> year course.
   Links to python material on *Brightspace* if need be.
- Coding guidelines and best-practice "rules" are on *Brightspace*.

Feel free to ask for coding help.
This is a physics class, not a programming class.

# Questions?



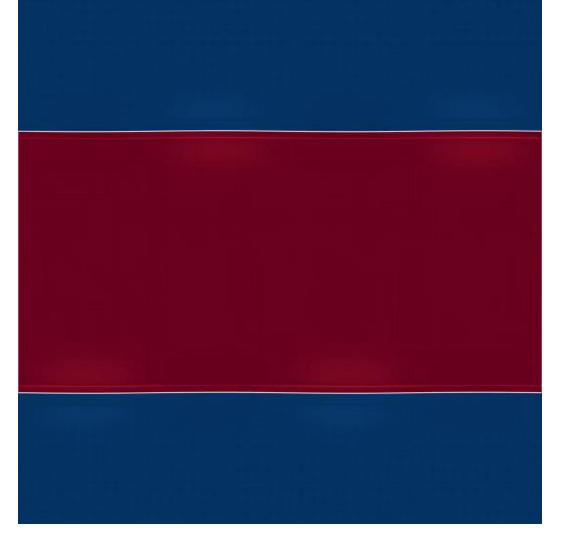


#### EAGLE: Evolution and Assembly of GaLaxies and their Environments

The evolution of intergalactic gas. Colour encodes temperature







Project 1: Molecular Dynamics

#### Organisation of the course - Program

#### Feb 09 – Introduction to MD, interactions, EoMs, boundary conditions

Feb 16 – Choice of units, energy of the system

Feb 23 – Verlet integration algorithm, minimum image convention

Mar 01 – Setting up initial conditions

Mar 08 – Observing the simulation: correlations & pressure

Mar 15 – Individual discussions

First project deadline: Thursday March 21 (midnight)

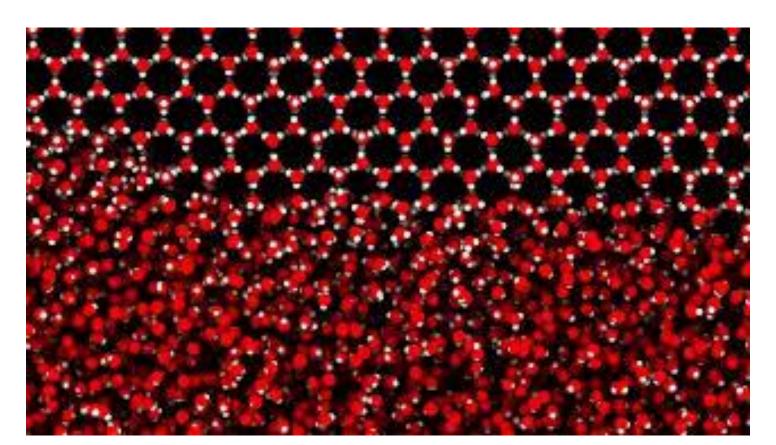
#### Molecular Dynamics (MD)

Main technique used to analyse the movement of **individual molecules (or atoms)** in systems too complex to be solved analytically.

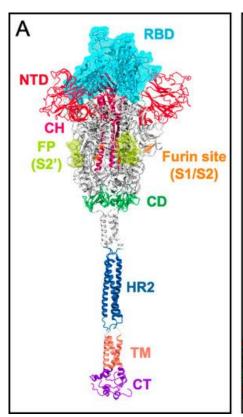
It is very popular in the fields of biophysics, material physics, soft matter, protein studies, etc.

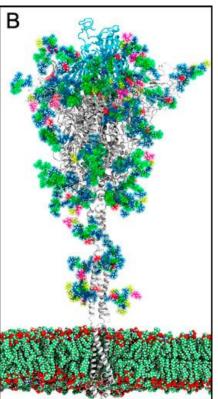
**Newtonian physics** is assumed to study the trajectory of particles (molecules, atoms) that interact using potentials.

# Molecule-by-molecule approach



# Recent example

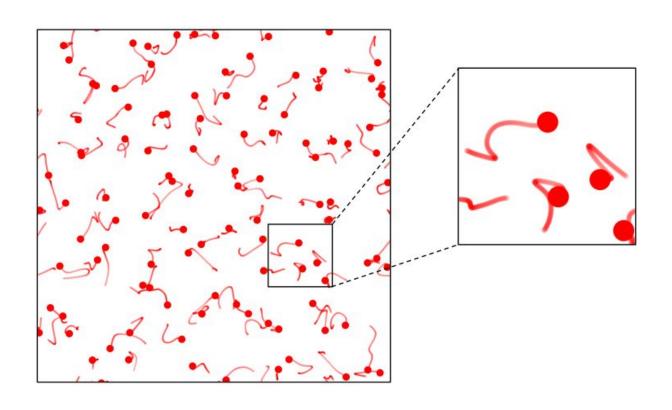




# Our target: Different phases of Argon

- Study the macroscopic properties (e.g. pressure) of Argon in its different phases (solid, liquid, gas) by varying the density and pressure of the medium.
- This will be done using an atom-by-atom molecular dynamics simulation of a small number of atoms.
- Atoms will interact via a simple potential-term.
- In the language of the simulation, each atom will be a particle.

# Our target: Different phases of Argon



#### Particle motion

We assume **Newtonian dynamics with a potential** U:

$$m\frac{d^{2}\mathbf{x}}{dt^{2}} = \mathbf{F}\left(\mathbf{x}\right) = -\nabla U\left(\mathbf{x}\right)$$

#### Particle motion

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For a system with many particles, the RHS becomes (for particle *i*):

$$\mathbf{F}\left(\mathbf{x}_{i}\right) = -\sum_{i} \nabla U\left(\mathbf{x}_{i} - \mathbf{x}_{j}\right)$$

## Numerical integration - Taylor expansion in time

We can't solve these equations analytically.

We will **discretize time** with a step in time of length h.

To move the particles from step n to step n+1, we will update the positions x and velocities y as follow:

$$\mathbf{x}_{n+1} = \mathbf{x}_n + \mathbf{v}_n h$$

$$\mathbf{v}_{n+1} = \mathbf{v}_n + \frac{1}{m} \mathbf{F} \left( \mathbf{x}_n \right) h.$$

If h is **small enough**, then this will approximate the correct answer.

#### The potential term

We choose to use the *Lennard-Jones* potential:

$$U(r) = 4\epsilon \left( \left( \frac{\sigma}{r} \right)^{12} - \left( \frac{\sigma}{r} \right)^{6} \right)$$

#### For Argon:

$$\epsilon/k_B = 119.8 \, \mathrm{K}$$
 $\sigma = 3.405 \, \mathrm{\AA}$ 

It depends only on the distance between particles. It contains an attractive term scaling as  $1/r^6$  (van der Waals interaction) and a repulsive term scaling as  $1/r^{12}$  (Pauli repulsion).

#### Simulation steps

- 1. Have a set of particles (atoms) with masses m, positions x, and velocities v.
- Compute the force acting on each particle due to every other particle in the system.
- 3. Update the positions and velocities using our time-step length h.
- 4. Go back to (1) and **repeat** until the end time is reached.

#### Time-step length

How do we decide what the time-step length h should be?

We got the expression for the integration of the positions and velocities from a Taylor expansion of the differential equations. We kept only the first term in that expansion. So we need to choose h small enough that the other higher-order terms do not matter.

→ For now, we can just make it small and see when it goes wrong.

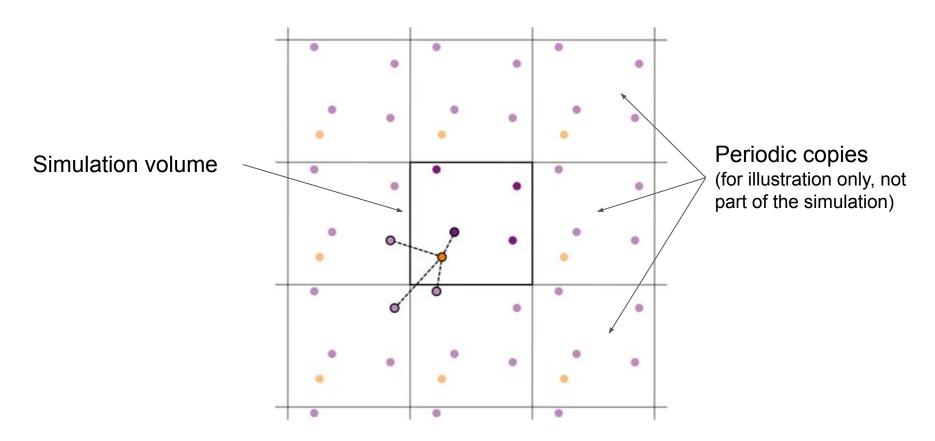
#### System boundaries

For obvious practical reasons, we can't simulate an infinite system.

We will hence use a box of size L and introduce so-called *periodic boundary conditions* such that the system has no effective edge.

→ When a particle leaves the box on one side, it re-enters on the other side.

## Minimum image convention



# Questions?

## Coding aspects

A few things to think about before typing:

What is the best way to represent particles in the code?

- numpy arrays are probably quite convenient for positions and velocities.

How can you decompose the problem into functions?

What are the constants of the problem and how to store them?

#### First Milestone

- Code up and play around with a simple system of <u>a few</u> atoms obeying the equations above and using a Lennard-Jones interaction potential.
- Use random positions and velocities in a periodic box using the minimum image convention.
- Store the particle trajectories in a file and plot them.

Note that 2D might be easier first!