

# Introduction to atomistic simulation methods in condensed matter

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## **Outline of the talk:**

**What is an atomistic simulation**

**How to compute material properties from first-principles.**

**Overview of approximations**

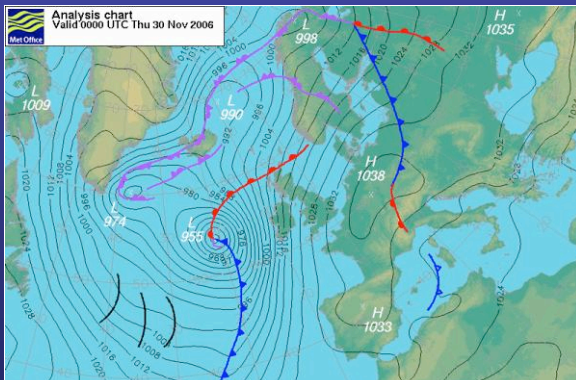
**Examples of realistic simulations**

# What is a Computer Simulation?

By “computer simulation” we understand the **use of a computer** to “**solve**” numerically the equations that govern a certain process.

Simulations are **present in every branch of science**, and even increasingly in every day life

## Weather forecast



## Flight simulations



## Finances



# What is a Computer Simulation?

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Simulations **in materials**: study the way in which the **blocks** that build the material **interact with one another and with the environment**, and determine the internal structure, the dynamic processes and the response to external factors (pressure, temperature, radiation, etc.)

# Why are simulations interesting?

Simulations are the **only general method** to solve **models** describing many particles interacting among themselves.

**Experiments** are sometimes **limited** (control of conditions, data acquisition, interpretation,...) and generally expensive

Simulations **scale up** with the increase of **computer power** (that roughly doubles every year!!)

# Why are simulations interesting?

Alternative to approximate solutions for models (traditional theory)

Complement and alternative to experimental research

First-principles  
simulations



The Torii metaphore  
(Prof. H. Nakamura)

Theory

Experiment

# Why are simulations interesting?

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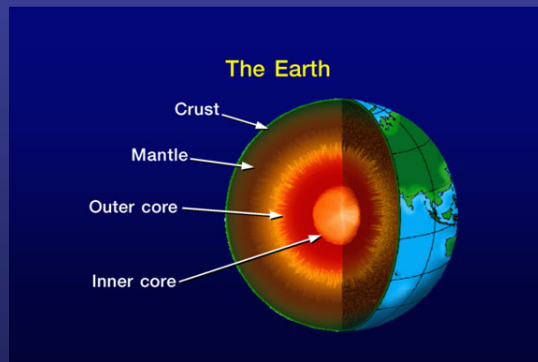
Complement and alternative to experimental research

Increasing scope and power with improving computers and codes

Level of accuracy



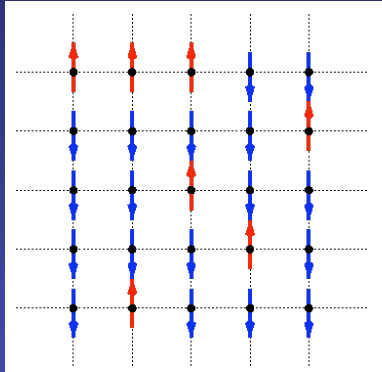
“Computer experiments”



**Model** of materials under circumstances far away from the conditions achievable in a lab., **under extreme conditions**

# Components of a simulation

1. A **model of the interactions** between the blocks that build the material



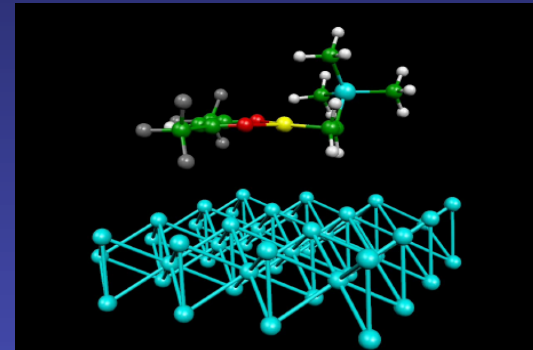
## Ising model:

A mathematical model of ferromagnetism in statistical physics.

Spins are treated as discrete variables that can be in one of two states.

Spins are arranged in a lattice or graph, and each spin interacts at most with its nearest neighbors.

$$\hat{H}(\sigma) = - \sum_{i \neq j} \sigma_i \sigma_j - \sum_j h_j \sigma_j$$



## Atomistic models

Wave function methods

DFT



# Components of a simulation

1. A **model of the interactions** between the blocks that build the material

2. A **simulation algorithm**: the numerical solution to the equations that describe the model.

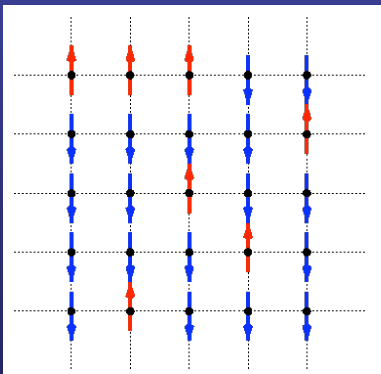
For the same model, there might be many different implementations,  
many available codes

3. A set of tools for the analysis of the results of the simulations

Ising model + Monte Carlo simulations

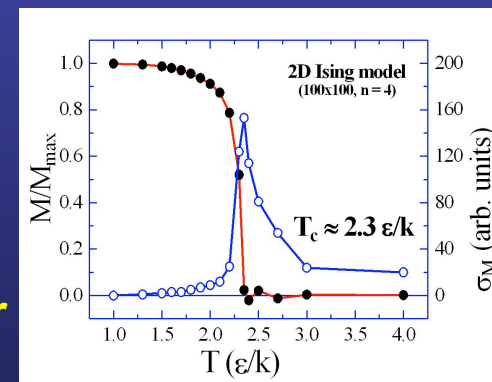


phase transitions



**Results:**  
Emergent properties  
not evident just looking  
at the equations

Use of computer essential for  
the exploration of the model



# Challenge of simulation of materials

Physical and mathematical foundations

What approximations come in?

**The simulation is only as good as the model being solved**

Systems with many particles and long-time scales are problematic

**Computed time is limited: relatively small number of atoms for relatively short times**

Space-time is 4D  $2 \times L_i \rightarrow \text{CPU} \times 16$

How we do estimate errors? (Statistical and systematic)

How do we manage ever more complex codes?

# Challenge of simulation of materials

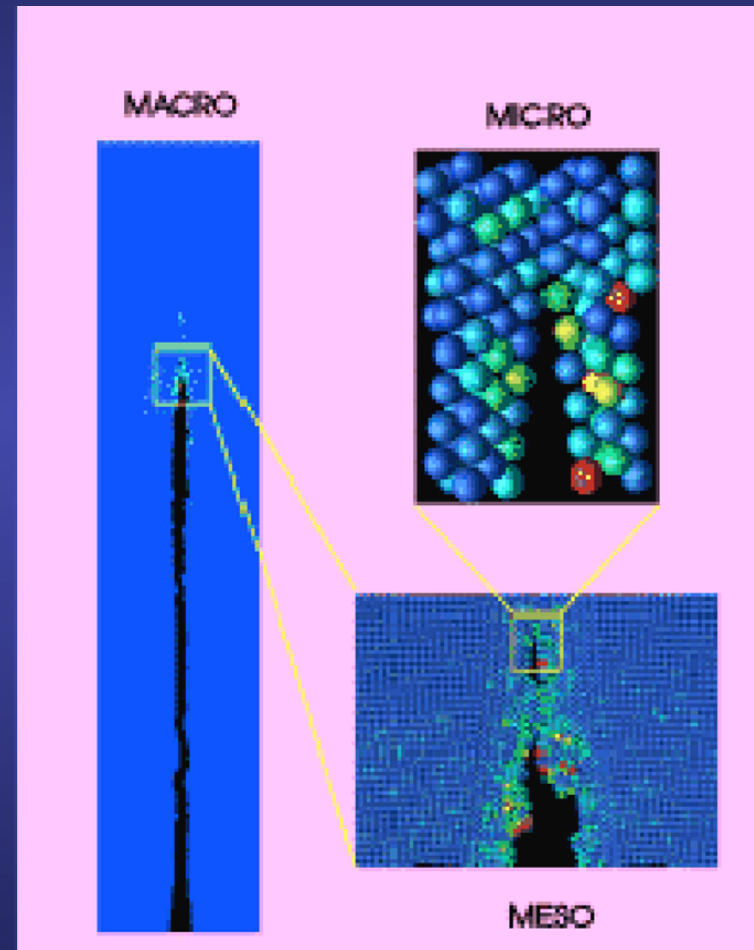
## Multiple scales

### Length scales:

1 cm – 1 Å ( $10^{-10}$  m)

### Time scales:

1 year – 1 fs ( $10^{-15}$  s)



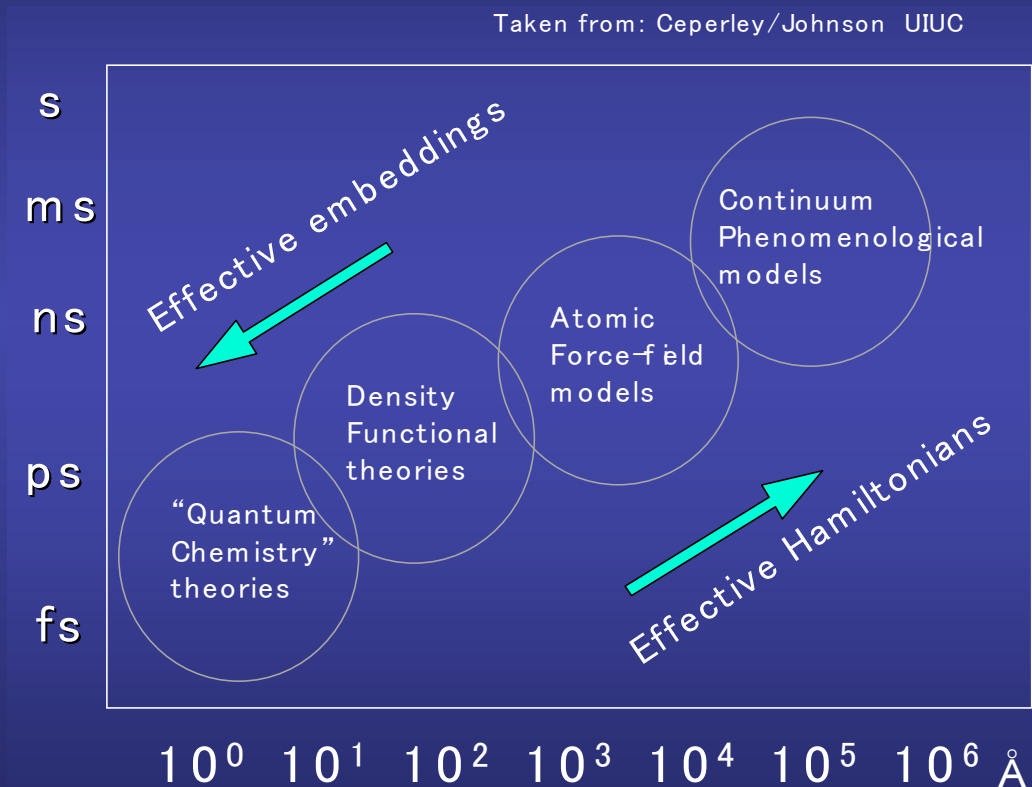
# Challenge of simulation of materials

## Multiple scales

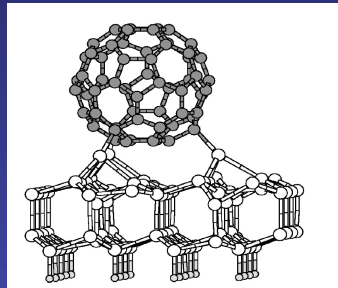
**Macro and mesoscopic**  
thermodynamic properties

**Atomic** structure and  
dynamics

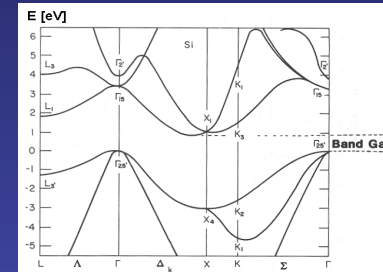
**Electronic states**  
chemical bonds and  
reactions, excitations...



# Goal: Describe properties of matter from theoretical methods firmly rooted in fundamental equations



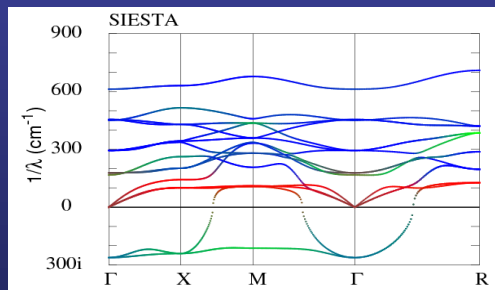
structural



electronic

**PROPERTIES**

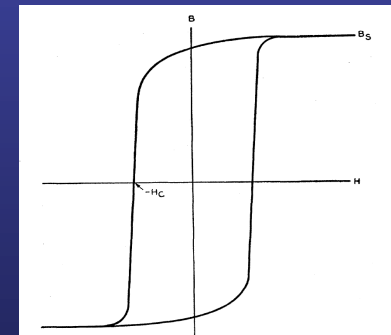
vibrational



optical



magnetic



## Modern atomic simulations follow Dirac's instructions (1929)

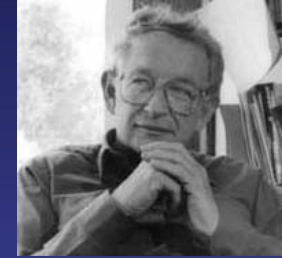


*“The general theory of quantum mechanics is now almost complete. The underlying physical laws necessary for the mathematical theory of a large part of physics and the whole of chemistry are thus completely known, and the difficulty is only that the exact application of these laws leads to equations much too complicated to be soluble.”*

*“...It therefore becomes desirable that approximate practical methods of applying quantum mechanics should be developed, which can lead to an explanation of the main features of complex atomic systems without too much computation.”*

**Goal of modern atomic simulations: implement that dream**

# The most important point: analysis and modelization of the results



In a first-principles simulations, what we have is the ultimate modeling of materials, whose solution requires the use of computers

*“A simple model can shed more light on Nature’s workings than a series of “ab-initio” calculations of individual cases, which, even if correct, are so-detailed that they hide reality instead of revealing it... A perfect computation simply reproduces Nature, it does not explain it.”*

**Philip W. Anderson**