

# **Métodos numéricos para escoamentos em nano e microescalas**

---

***Caetano R. Miranda***

Dept. of Mat. Phys. and Mechanics- Institute of Physics

***Julio Romano Meneghini***

Mechanical Eng. Department at Escola Politécnica

***Rafael dos Santos Gioria***

Petroleum Eng. Department at Escola Politécnica  
University of Sao Paulo (USP)



[crmiranda@usp.br](mailto:crmiranda@usp.br)

# Outline

---

- 1. Course structure*
- 2. Multiscale molecular simulations*
- 3. Complex physical phenomena in Materials (Nano and Microfluidics)*

# PME5429

---

- **Prof. Caetano Rodrigues Miranda**
  - **Prof. Julio Romano Meneghini**
  - **Prof. Rafael dos Santos Gioria**
- 
- **Período: Diurno**
  - **Horário: Terças            09:00h às 12:00h**

**RCGI**

**Home-page:**

**<https://edisciplinas.usp.br/course/view.php?id=82131>**

**Calendário da disciplina (tópicos, cronograma, ...)**

- **Atividades**
- **Notas de aula**
- **Conceitos, etc.**

# Avaliações

---

**Labs e Projeto:**  $Média = \frac{Labs + Proj}{2}$

**Relatórios, apresentação do Projeto**

**Conceitos:**

<b>A</b>	<b>Média de 9,0 a 10,0</b>
<b>B</b>	<b>Média de 7,5 a 9,0</b>
<b>C</b>	<b>Média de 5,5 a 7,5</b>
<b>D</b>	<b>Média de 4,0 a 5,5</b>
<b>F</b>	<b>Reprovado</b>
<b>O</b>	<b>Reprovado por faltas (&gt; 6 faltas!)</b>

# Métodos numéricos para escoamentos em nano e microescalas

---

## **Objetivos:**

Apresentar técnicas avançadas de simulação de fenômenos de transporte e dinâmica dos fluidos em Engenharia (mecânica, aeronáutica, química, naval, civil, petróleo, bio-engenharia, entre outras).

Apresentar métodos de simulação de escoamento com aplicações em nano e micro-fluídica, assim como técnicas de acoplamento dessas escalas para macro escalas nas quais a hipótese do contínuo são aplicáveis.

Cobrir métodos em nano e micro-escalas, e.g. atomísticos (Dinâmica Molecular e Método Monte Carlo) e redes de Boltzmann.

Apresentar metodologias de acoplamento desses com métodos convencionais em Dinâmica dos Fluidos Computacional.

# Métodos numéricos para escoamentos em nano e microescalas

---

- Método: Base - Exploração – Aplicação

***Métodos em multiescala:*** atomísticos (Dinâmica Molecular e Método Monte Carlo), redes de Boltzmann, e Dinâmica Computacional de fluídos (volumes / diferenças finitas e elementos finitos).

- Foco na exploração do método
- Ênfase na experimentação dos métodos através de laboratórios computacionais.
- Aplicações na indústria do Petróleo
- Organização: Aulas + Laboratório
- Avaliação: Lab + Projeto

# Lab

---

- Linux / Computação Científica

## ***Micro:***

- Dinâmica Molecular

## ***Multiescala:***

Acoplando Dinâmica Molecular e Redes de Boltzmann

## ***Macro:***

- Métodos do contínuo

# Projeto e seminário

---

- Propor um projeto na linha de dinâmica de fluídos a partir de um enfoque em multiescala

Motivação

Importância para indústria

Estudo em micro e macro escalas



# Cronograma

	Ter	atividade	Instrutor
set	8		
	15	Apresentação do Curso / Métodos Multiescala	Caetano
	22	Ambientação - Máquina Virtual / Projeto / Linux	Caetano / Kirch
	29	Dinâmica Molecular 1	Caetano / Kirch
out	6	Lab 1 - Dinâmica Molecular -Fluidos bulk (Estrutura e Transporte)	Caetano / Kirch
	13	Dinâmica Molecular 2	Caetano / Kirch
	20	LAB 2 - Dinamica Molecular -Interfaces (Tensão Interfacial) & Viscosidade	Caetano / Kirch
	27	LBM	Julio / Adriano
nov	3	LBM	Julio / Adriano
	10	CFD	Julio / Rafael
	17	CFD	Julio / Rafael
	24	CFD	Julio / Rafael
	1	CFD	Julio / Rafael
dez	8	Projeto - Apresentação	Julio / Rafael / Caetano
	15		

# Referências

---

- Notas de aula
- Artigos relevantes ao método
- Computational Materials Science - Dierk Raabe
- Crystal, Defects and Microstructures - R. Phillips
- Primer on Molecular Dynamics - Ercolessi
- Computer simulations of Liquids - Allen/Tildesley

As referências relevantes serão distribuídas em classe.

# PME5429 – Edição 2020

---

## ▣ ***Aulas e laboratórios***

- Síncronas e assíncronas (Lives e vídeos de 30 – 60 min)
- Cada aula (3 partes – 45 min com 5 min de intervalo)
- Máquina virtual e/ou acesso remoto
- Engajamento e contato contínuo
- Transmedia (E-disciplinas, Instagram, whatsapp, ...)
- Participação importante: atividades coletivas (artigos)
- Gamificação

# PME5429 – Edição 2020

---

## □ ***Ambientação***

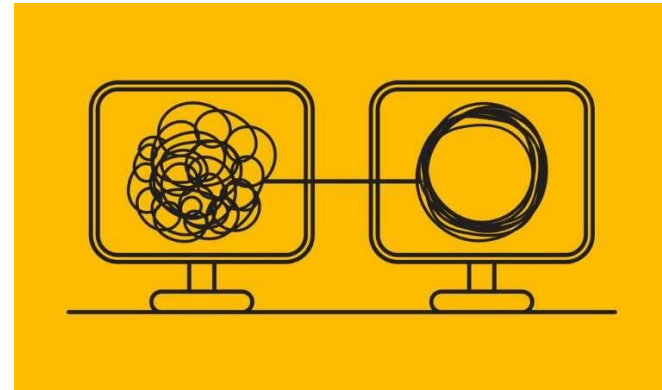
- Montagem das máquinas virtuais e acesso remoto
- Introdução ao Linux, programas de visualização e VR
- Bibliografia a ser distribuída
- Dúvidas: de imediato use ***hotlines***

# Tenho dúvidas nas aulas assíncronas ... o que fazer ?

---



Dúvidas use o HOTLINE:  
[crmiranda@usp.br](mailto:crmiranda@usp.br)  
Assunto: SCM2020



*Todas as dúvidas serão comentadas no início das aulas.  
Projetos e Labs*

# Seu perfil ?

---

<https://docs.google.com/forms/d/e/1FAIpQLSfrv1BXsKjGadnzFDCKM8JlVfclXJiNMyZlnE2Xpi4kZG2Tg/viewform>

# Quem é seu professor ? Experiência Profissional (Nano / porous media / fluidics)

---

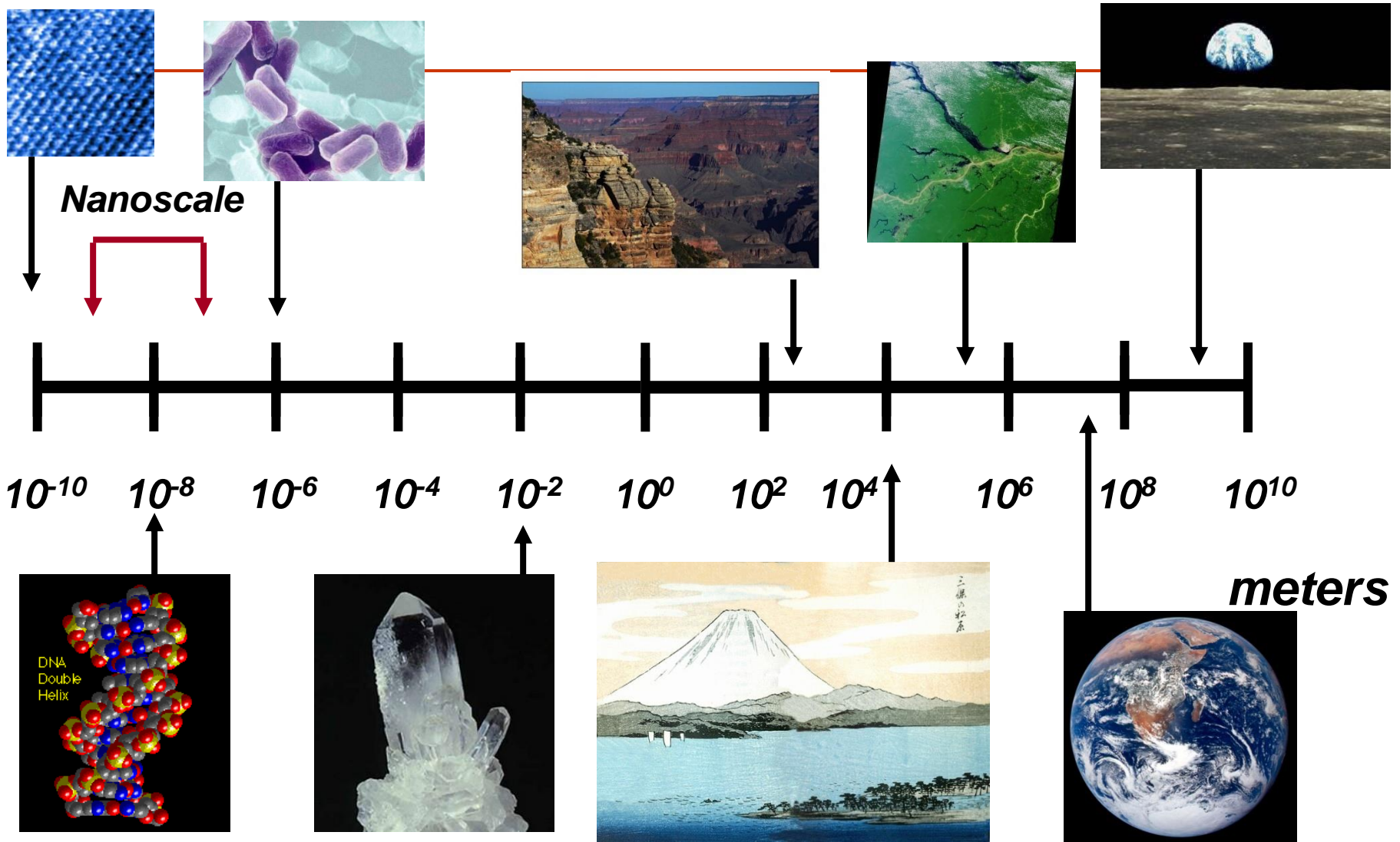
- ❑ Do pai poeta, sempre ouvia as palavras de Heráclito, “Tudo flui e nada permanece”.
- ❑ Intrigado, voltou-se à Física tendo como alma matter, a Unicamp. Finalizou o doutorado levado a chá preto na Universidade de Cambridge, Inglaterra.
- ❑ Como pos-doc, embembeu-se de café no ICTP em Trieste – Itália e coca-cola no MIT explorando simulações moleculares aplicados a materiais sob condições extremas e nanotecnologia.
- ❑ Foi professor assistente na Universidade de Kyoto, onde transgrediu percolando água sobre chá verde em alta pressão, enquanto introduzia simulações moleculares para indústria do petróleo.
- ❑ Após passagem pela UFABC, é atualmente professor no IFUSP desenvolvendo projetos em dinâmica de fluídos em materiais complexos e design computacional de materiais nanoestruturados para aplicações em energia, combinando realidade virtual e simulações moleculares em multiescala.
- ❑ Desenvolve projetos com o setor produtivo e realiza experimentações envolvendo diálogos entre ciência e arte.

---

**SCALE**



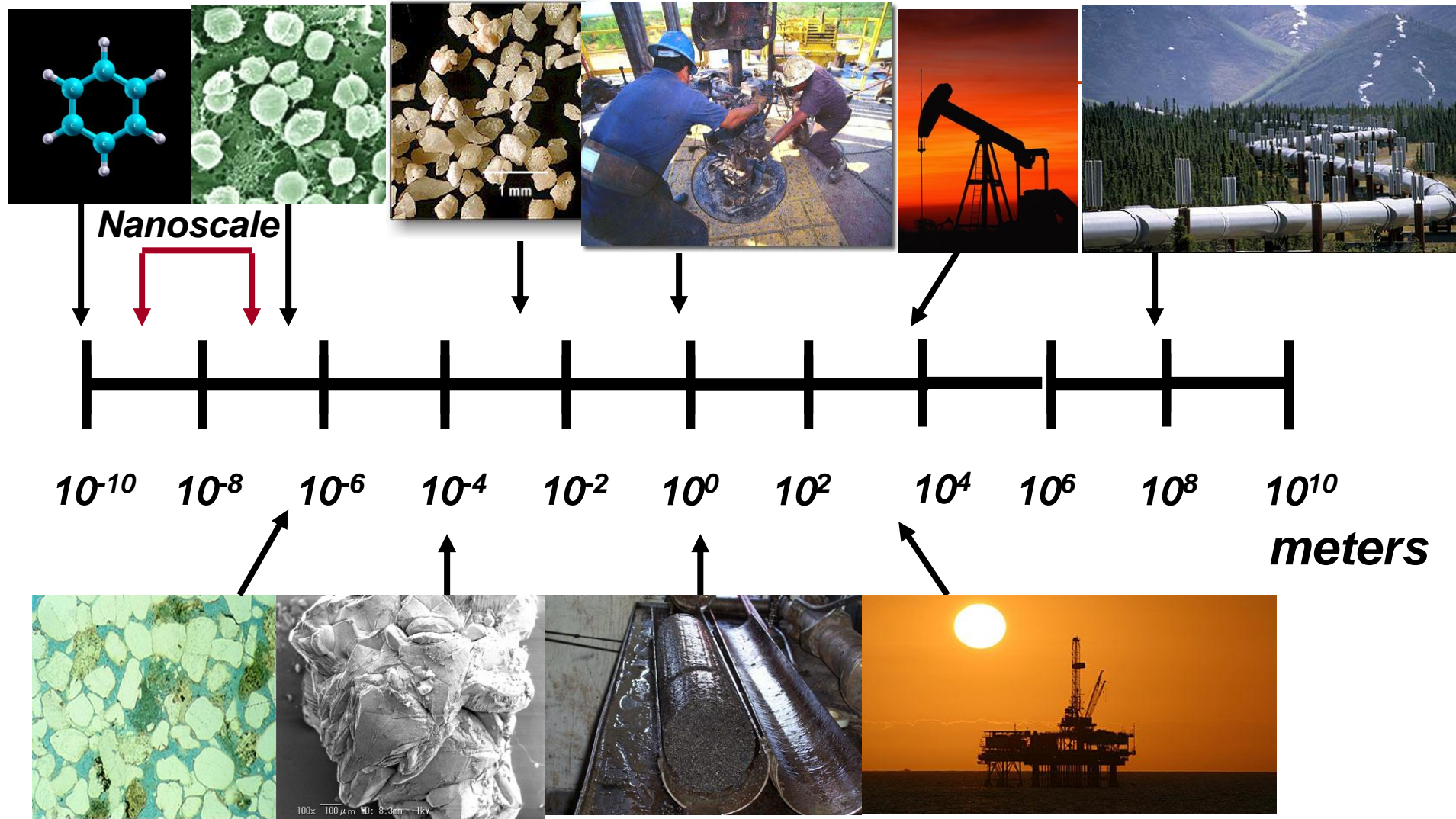
# Escalas



Parte 1 - Nano a Micro

Parte 2 - Meso a Macro

# Crossing scales in Oil & Gas



Oil&Gas: How the large can drive small systems ?

# Operating conditions

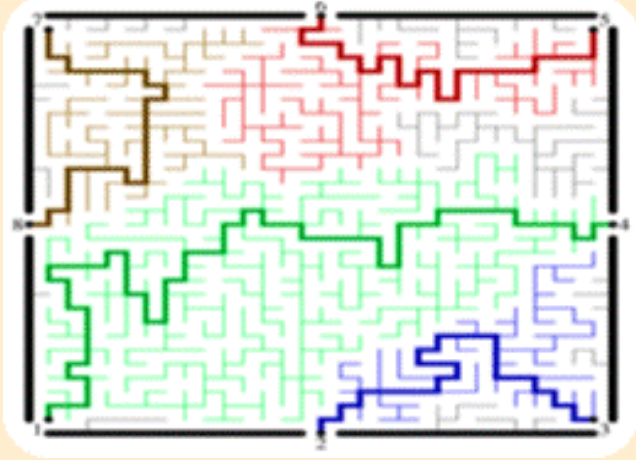
## (relatively harsh conditions)

---

- ❑ Depths: 1.5 – 4.5 km
  - ❑ Temperatures: 0 to 180°C
  - ❑ Pressures: 0 to 8 Kpsi ( 0 - 550 atm)
  - ❑ pH: 4-8 (acidic)
  - ❑ Presence of: complicated fluids, water and clays (heterogeneity)
  - ❑ Salinity: seawater to very concentrated
  - ❑ Size (pore throats in rock formations):  $\leq 5 \mu\text{m}$
- 
- The current average recovery factor from conventional oil reservoirs is  $\sim 35\%$ .
  - Poor sweep effect in the reservoir & capillary forces

# From simple models to solve some problems in industry

---



## ***“Toy models” in Physics***

- Simple models
- Strong approximations
- Ideal conditions
- Relative time and length scales
- Searching for analytical solutions or universality classes

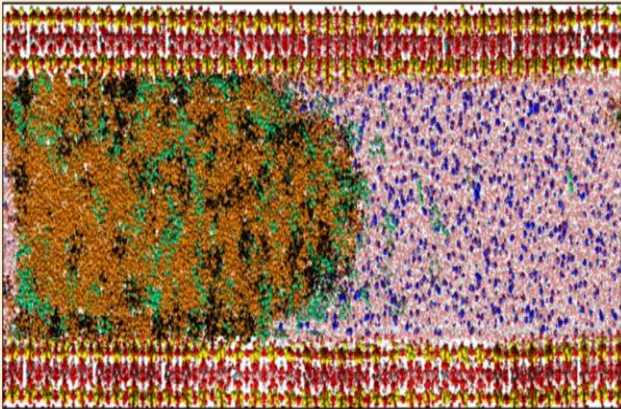
## ***Industry:***

- Complex systems
- Heterogeneity
- Real conditions
- "Macroscopic"
- Trial-and-error method



How the knowledge of atomic and molecular interactions can contribute in the development and industrial innovation ?

# From simple models to solve some problems in industry



## ***Multiscale comp. methods:***

- Complex models
- Controlled approximation
- Real conditions
- Molecular Scale  
"Microscopic"
- Solutions based on the knowledge acquired

## ***Industry:***

- Complex systems
- Heterogeneity
- Real conditions
- "Macroscopic"
- Trial-and-error method

# Length and time scales in materials modeling



NASA Langley Research Center

Hampton, Virginia

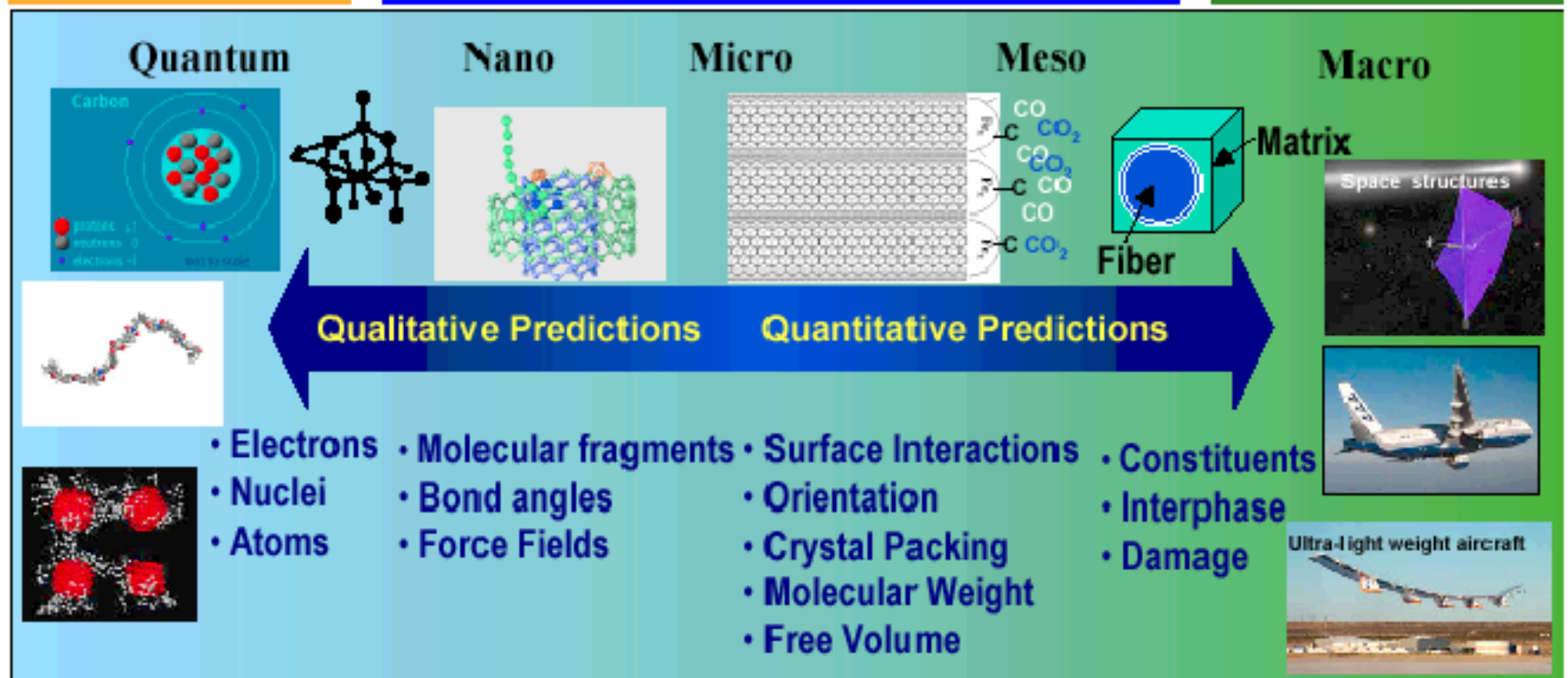
Computational Materials - Nanotechnology Modeling and Simulation

by Greg Odegard, NASA

## Computational Chemistry

## Computational Materials

## Computational Mechanics



$10^{-12}$

$10^{-9}$

$10^{-6}$

$10^{-3}$

$10^0$

Length, (m)

**Time Length**

(year)

$10^7$

$10^0$

$10^{-7}$

(Debye)

$10^{-14}$

Macro

Meso

Micro

Nano

(m)

$10^0$

(mm)

$10^{-3}$

( $\mu m$ )

$10^{-6}$

(nm)

$10^{-9}$

large scale FEM, FD  
(large-scale plasticity,  
elasticity, heat transport,  
etc.)

cellular automata,  
percolation models  
(scale independent)

crystal plasticity FEM

homogenization methods:  
Taylor, Sachs, Voigt, Reuss,  
Hashin-Shtrikman, and self-  
consistent models in conjunction  
with advanced constitutive laws

kinetic multistate Potts models

Ginzburg-Landau-type  
and kinetic phase field  
models, microscopic  
field kinetic models

dislocation dynamics

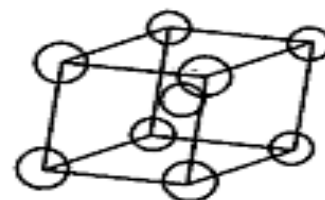
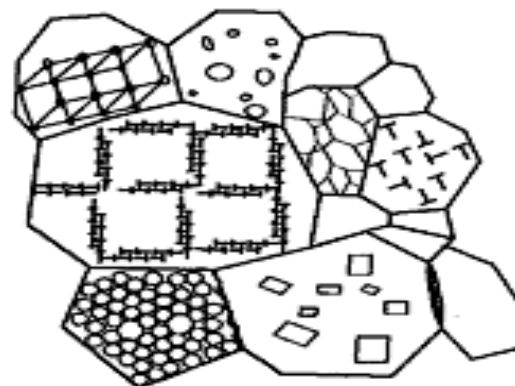
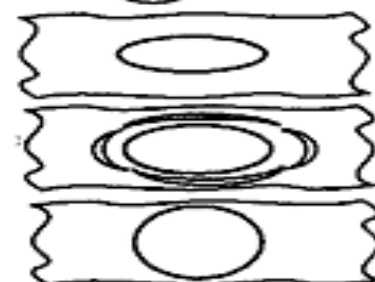
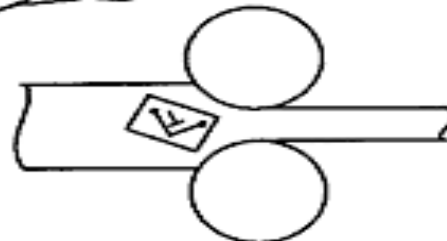
topological network and  
vertex models, boundary  
dynamics

spring models

molecular dynamics

Metropolis Monte Carlo

local electron density  
functional theory

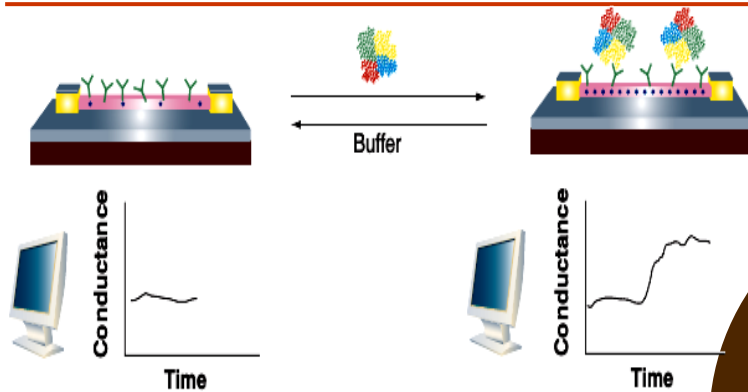




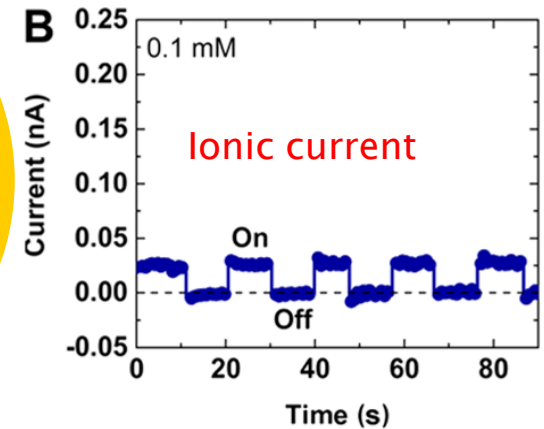
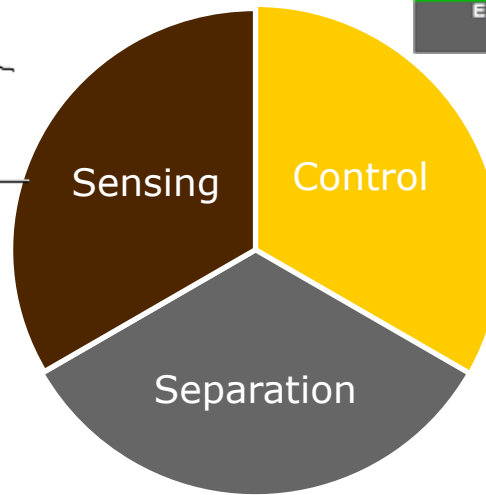
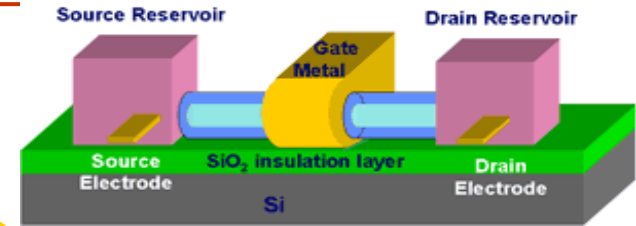
---

# NANOFLUIDICS

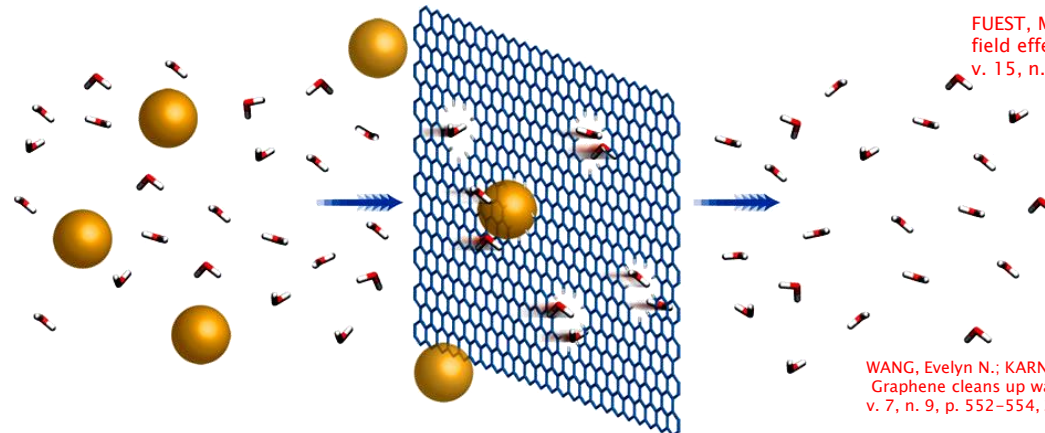
# Nanofluidics



PATOLSKY, Fernando; ZHENG, Gengfeng; LIEBER, Charles M. Nanowire sensors for medicine and the life sciences. 2006.

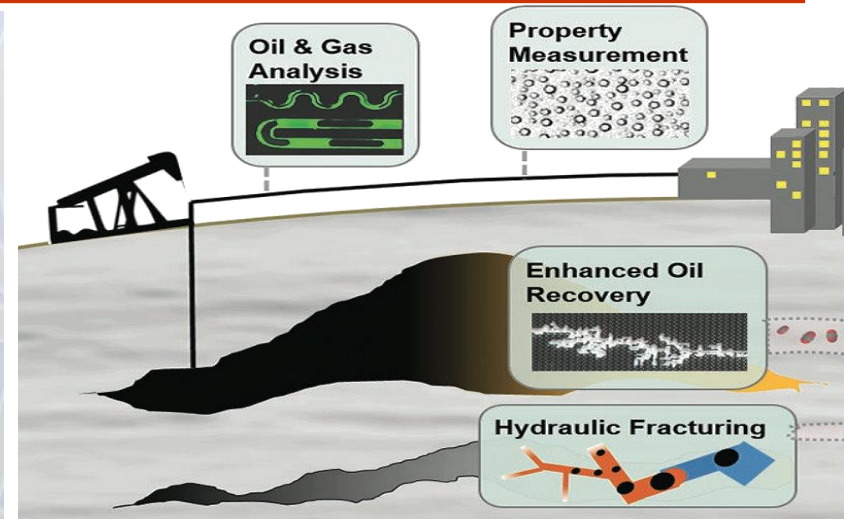
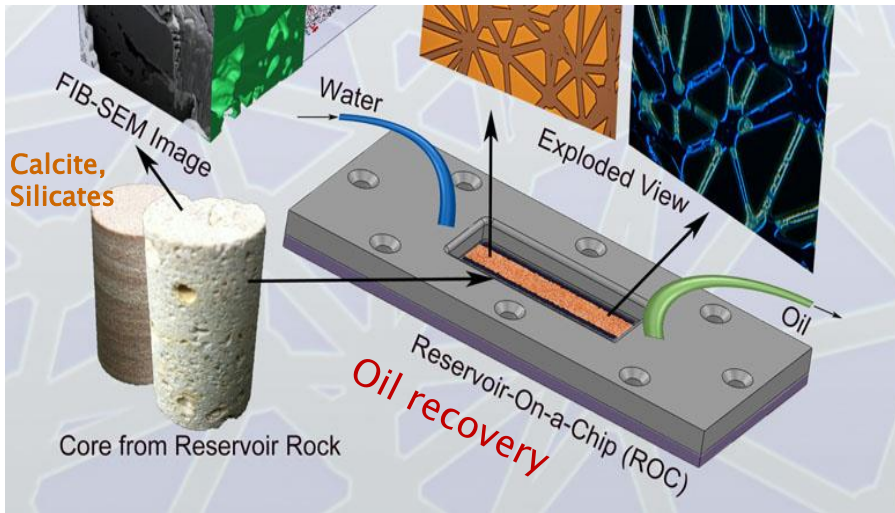


FUEST, Marie et al. A three-state nanofluidic field effect switch. *Nano letters*, v. 15, n. 4, p. 2365-2371, 2015.



WANG, Evelyn N.; KARNIK, Rohit. Water desalination: Graphene cleans up water. *Nature nanotechnology*, v. 7, n. 9, p. 552-554, 2012.

# Nanofluidics



Naga Siva Kumar Gunda, Bijoyendra Bera, Nikolaos K. Karadimitriou, Sushanta K. Mitra and S. Majid Hassanizadeh (2011) Reservoir-on-a-Chip (ROC): A new paradigm in reservoir engineering. *Lab Chip*, 11, 3785–3792

Sinton, D., 2014. Energy: The Microfluidic Frontier. *Lab on a Chip*, 14 (17): 3127–3134. Available on <http://www.spe.org>

- ❑ Low reagent volumes;
- ❑ Low cost;
- ❑ Excellent control of environment conditions;

❑ Fluidic-based analysis and separations tools for applications in the chemical industry;

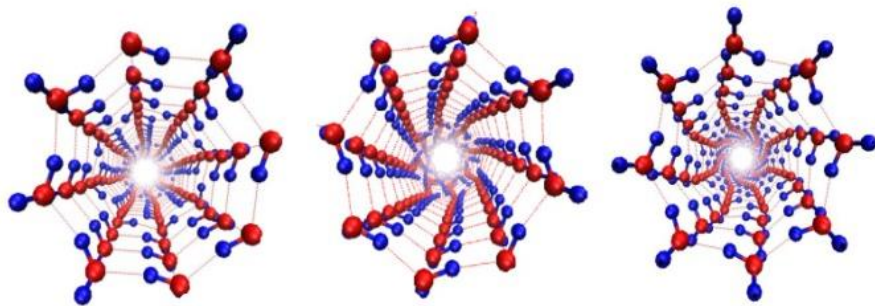
❑ Better fluid property measurement and fluid analysis;

❑ Understand pore-scale process in reservoirs

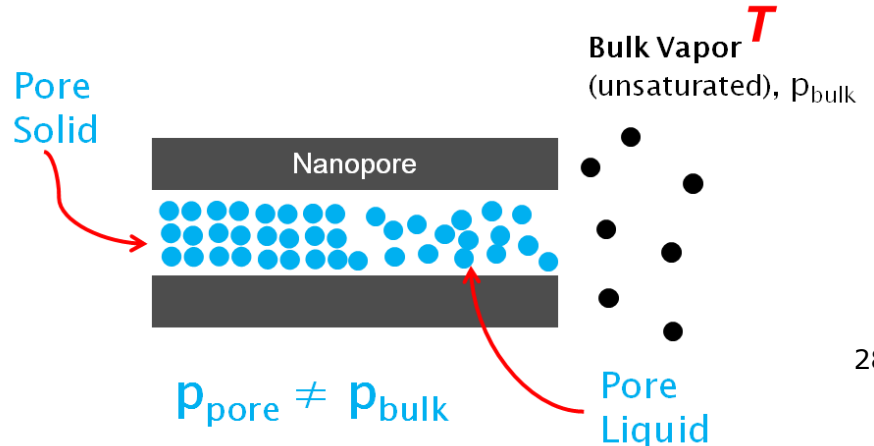
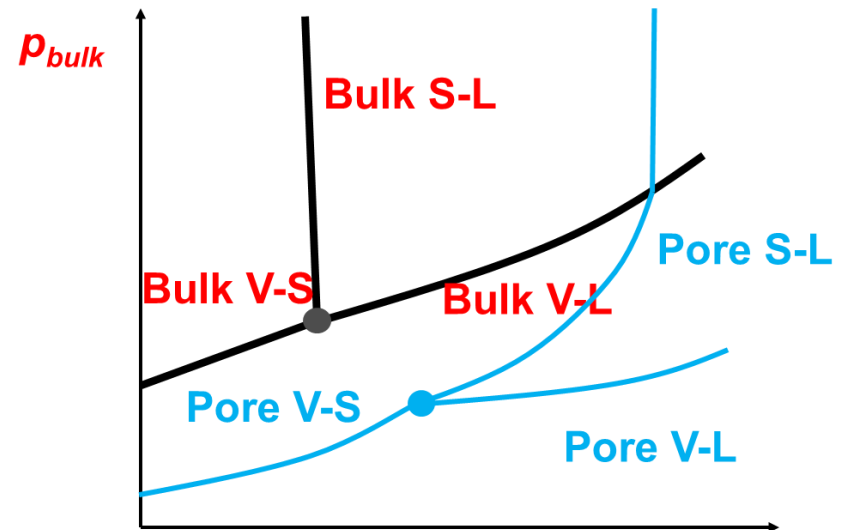
# Nanofluidics

## Water structuring

300K, 1 atm



## Phase Diagram

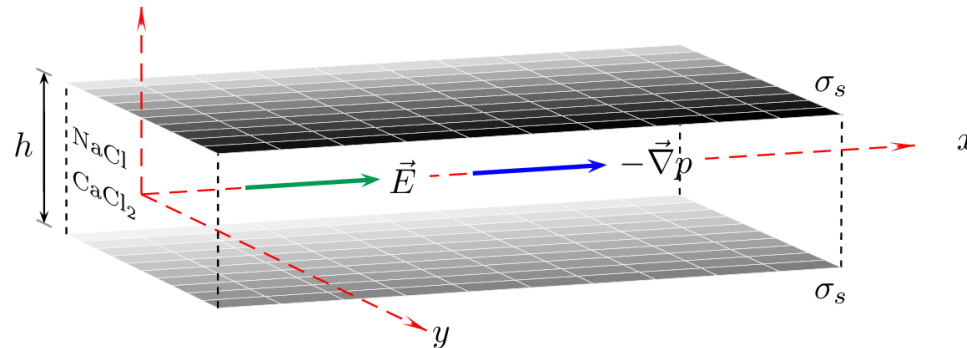
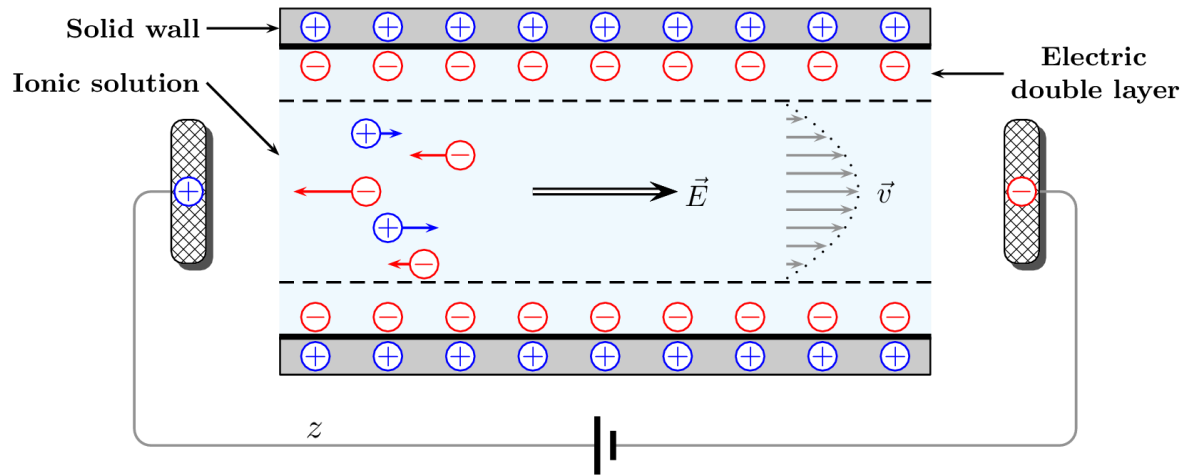


Phys. Chem, 2015, 17, 7303

---

# LIMITS ATOMISTIC AND CONTINUM

# Phenomenon of Electroosmosis



## Electroosmosis

- Electrostatic (Ion concentration)
- Hydrodynamic (Velocity profile)

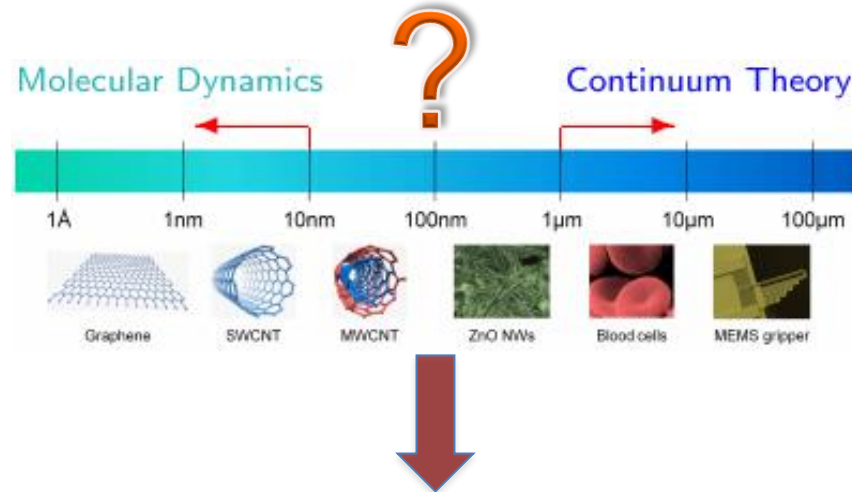
# Phenomenon of Electroosmosis at nanoscale

## Molecular Dynamics

- Euler – Lagrange equations
- Interatomic potential

## Continuum Theory

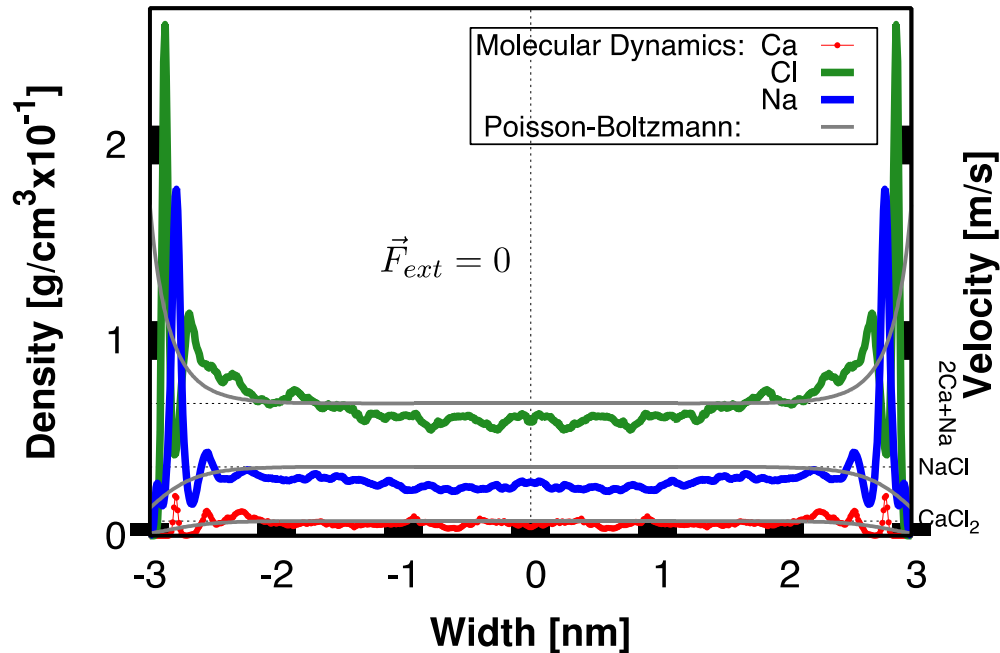
- Electrostatic (Poisson – Boltzmann)
- Hydrodynamic (Navier – Stokes)



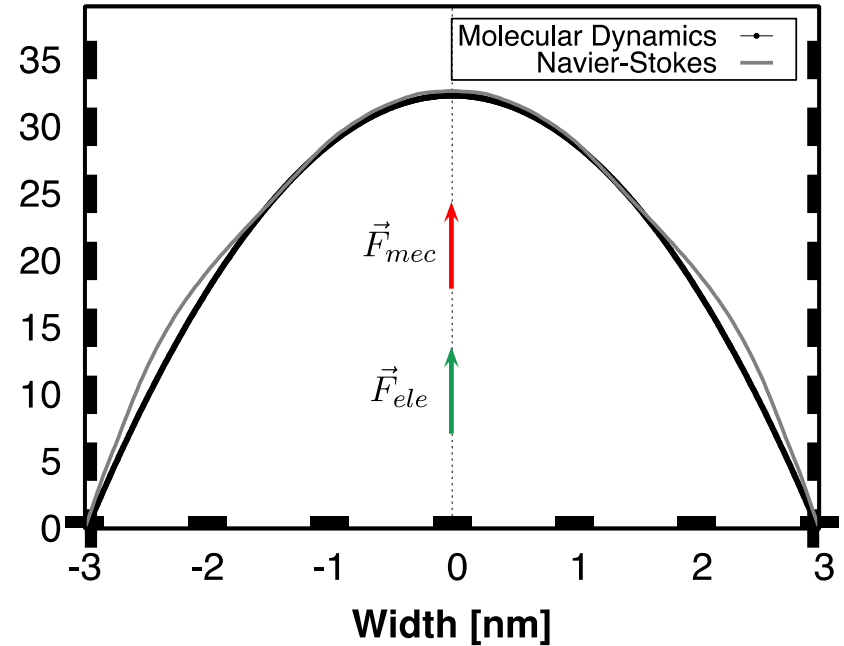
- Modified Poisson – Boltzmann equation
- Embedding Velocity MD (in Navier – Stokes )

# Limitations at nanoscale

Ion concentration



Velocity profile



MD ( $h > 10$  nm)

High

- Computational cost
- Simulation time

CT ( $h < 1000$  nm)

Neglects

- Atomic interaction
- Variable viscosity



# Nanofluidics

NANOFLUIDICS

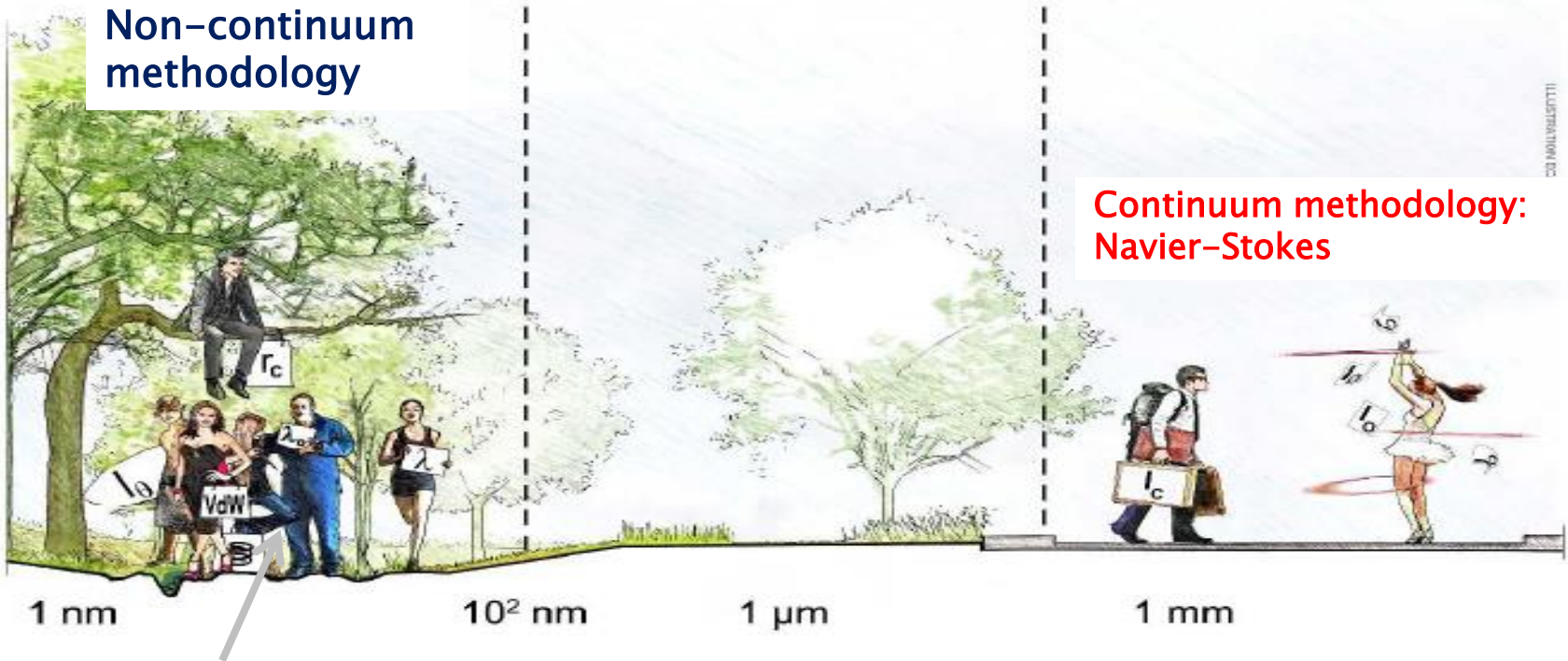
MICROFLUIDICS

MILLIFLUIDICS

BOCQUET, Lyderic; TABELING, Patrick. Physics and technological aspects of nanofluidics. Lab on a Chip, v. 14, n. 17, p. 3143–3158, 2014

Non-continuum methodology

Continuum methodology: Navier-Stokes



- ❑ Noncontinuum description
- ❑ Surface-dominated
- ❑ Low Reynolds number
- ❑ Multiscale and multiphysics

*How the characteristic scales pertaining to the 1-100 nm range interfere with the system size ?*

*Can they combine together to produce new physical effects ?*

---

# MULTISCALE APPROACHES

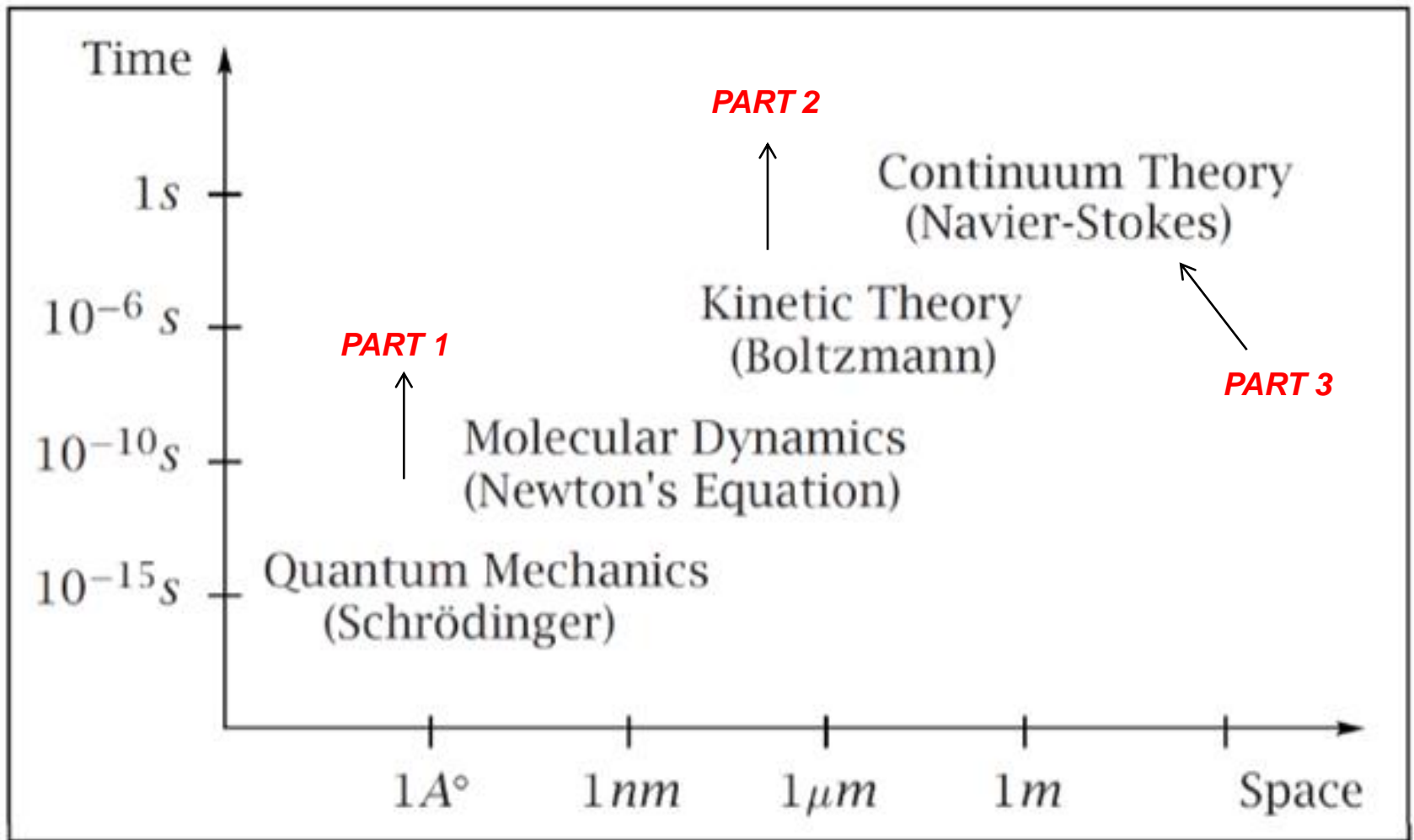
# What is multiscale modeling and why do we need it ?

---

- Physical-chemistry phenomena in materials can occur in different scales
- **Challenge:** modeling a physical phenomena ranging from micro to macro
- So far, models are created for particular scale of interest
- ***Finer*** scale processes often govern processes seen at ***coarser*** scales and vice versa
- **Multiscale Modeling:** combination of models from different scales.

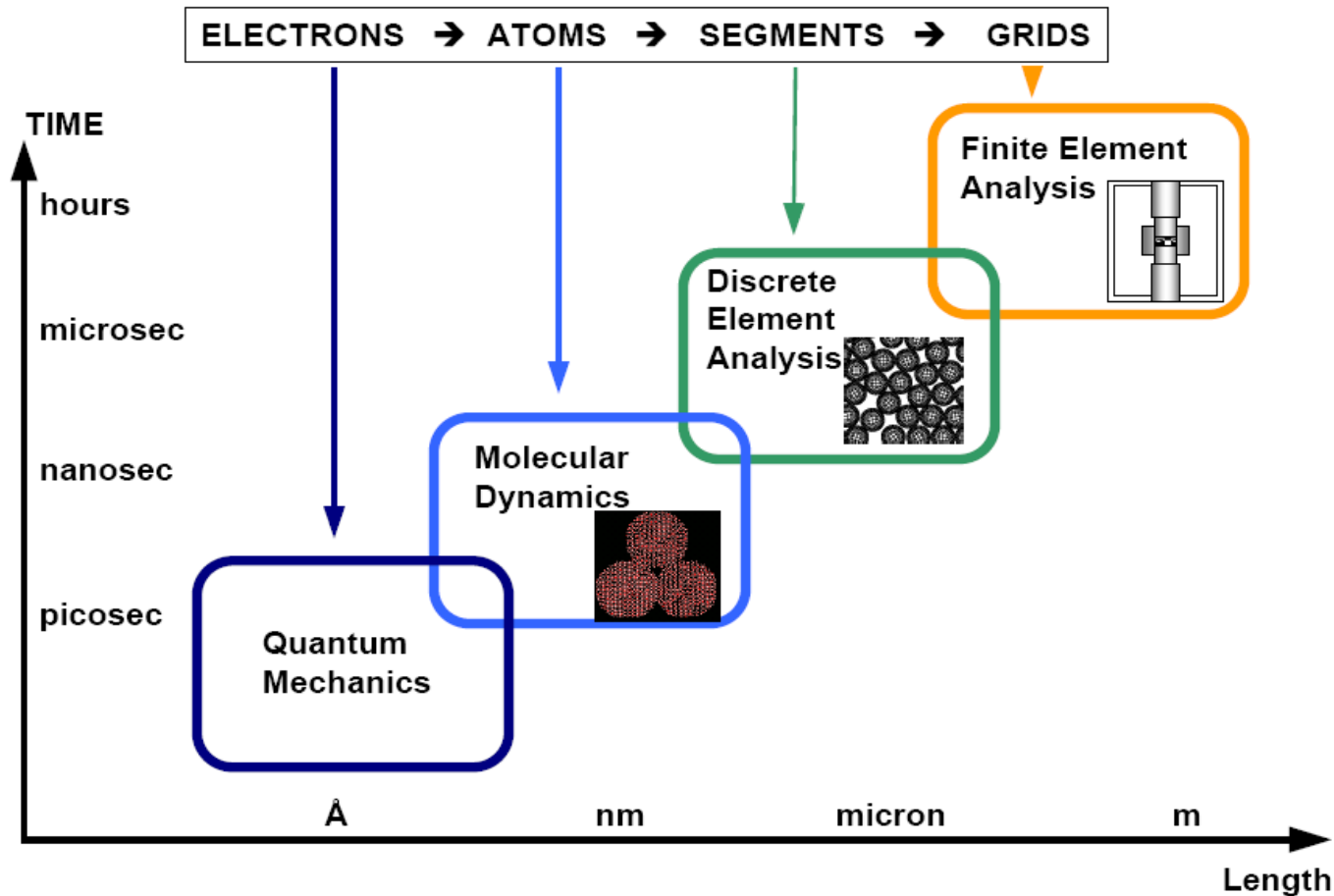
# Multiscale in the laws of Physics

---

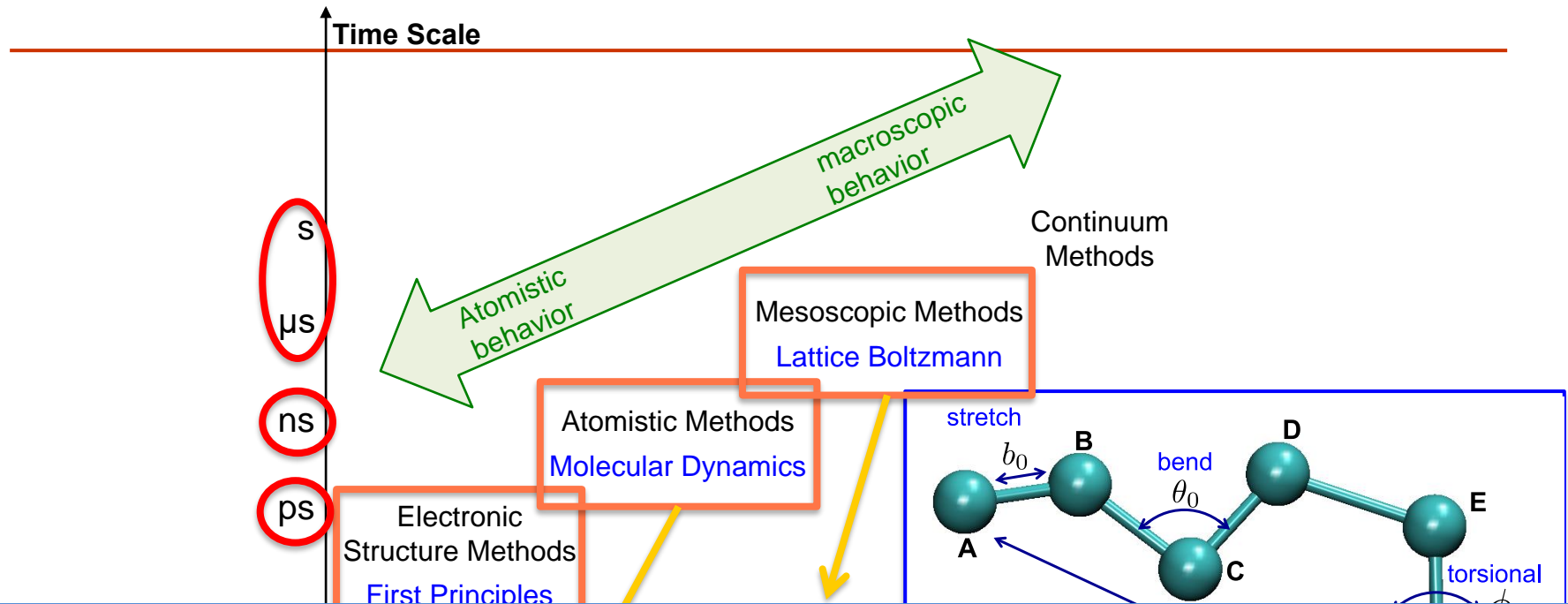


# Modeling across scales

## Multi-scale Computational Hierarchy of Materials Simulations



# Multiscale computational approach



Simplifies the Boltzmann equation by

- Understanding of fluid behavior at the microscale
- Phase separation, interface instability, bubble/droplet dynamics and wetting effects

$$\mathbf{v} \nabla_{\mathbf{x}} f + \mathbf{F} \nabla_{\mathbf{p}} f + \frac{\partial f}{\partial t} = \Omega$$

$$f_i(\mathbf{x} + \mathbf{e}_i \Delta t, t + \Delta t) = f_i(\mathbf{x}, t) + \Omega_i(\mathbf{x}, t)$$

# MD ab initio and classical X LBM: a soccer perspective



Ab initio MD



Classical MD



LBM

## foosball

Simple way to describe  
the movement of players  
during a game

# How to combine the scales ?

---

- Goal: to obtain **constitutive laws** and **physical properties** of a given system, whose parameters can be determined from a **finer/coarser** scale models:

Microscopic  $M(p, m_1, m_2, \dots, m_n) = 0$



Continuum  $C(p, c_1, c_2, \dots, c_p) = 0$



# Linking levels of resolution: energies, time and length

---

- **Coarse graining methods** are characterized by the physical quantities, which the **models of different levels** are supposed to **reproduce** as **accurate** as possible.
- The link between levels of resolution can be based on:
  - i) **Potential energy surface** (energy and forces)
  - ii) **Structure** (characteristic time and length scales)
  - iii) **Environment** (electrostatic, hydrodynamics, elastic, ...)
- “The first **ansatz** directly allows for a forward and backward mapping of the investigated systems.”

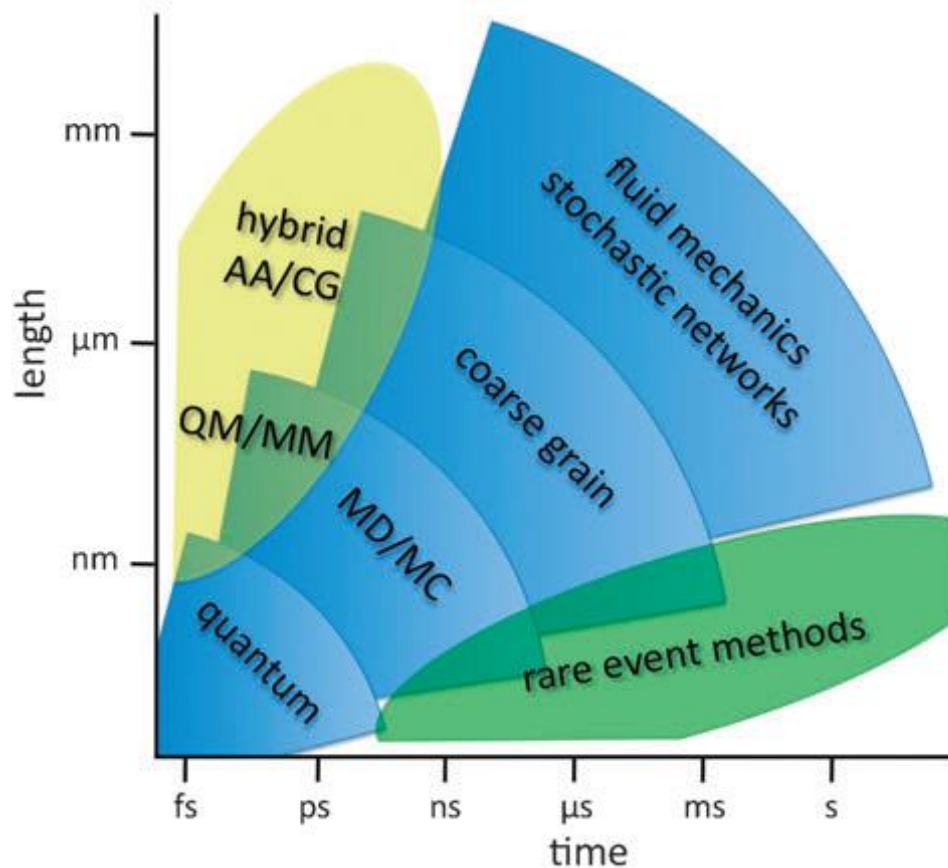
# Multiscale Modeling strategies

---

- Different ways to combine each levels of resolution (energy, time and/or length):
  - (i) **Sequential**: the simulation models on different scales are treated separately by simply transfer information between levels of resolution. (mature)
  - (ii) **Hybrid**: different levels of resolution are running simultaneously with a direct link between them, (developed)
  - (iii) **Adaptive**: switch between resolution levels on the fly (work in progress – problem specific)

# Which one choose ?

- ▣ The size and time scale of the problem,
- ▣ the accuracy of the method,
- ▣ the desired resolution,
- ▣ the available computing resources.



*From: Recent progress in adaptive multiscale molecular dynamics simulations of soft matter*  
S. O. Nielsen, R. E. Bulo, P. B. Moore and B. Ensing,  
*Phys. Chem. Chem. Phys.*, 2010, 12, 12401