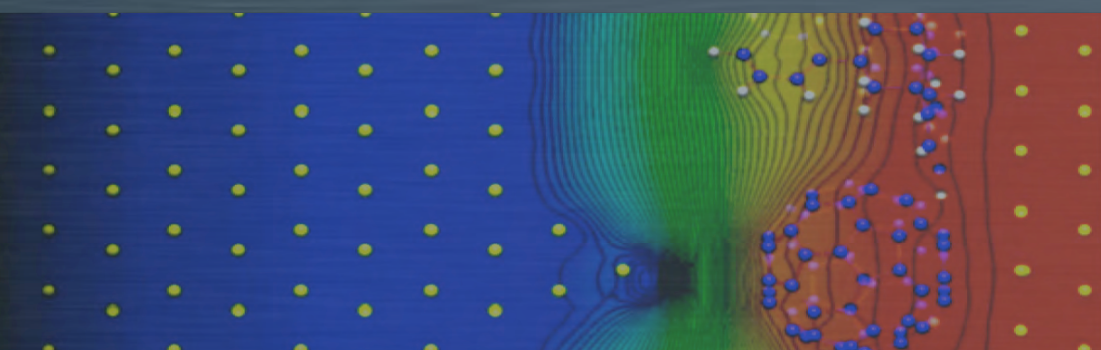


# Beating the Size Limits of First-Principles Calculations in Nanoscale Systems

Pablo Ordejón

Theory and Simulation Group @



CIN2

CENTRE D'INVESTIGACIÓ  
EN NANOCIÈNCIA  
I NANOTECNOLOGIA  
CAMPUS UAB. BELLATERRA. BARCELONA



## OUTLINE:

- Some reflexions on atomistic simulations and HPC: What are the limits?
- SIESTA: a DFT code
- Transport from DFT: TranSIESTA
- One example of DFT (including transport): CNT-linked graphene layers
- Going to larger systems:
  - Transport in the meso-scale: O-functionalized graphene
  - QM/MM for MD simulations: Proteins, Au nanoparticles and graphite



# “Complexity” of a Simulation

The relation between computing time  $T$  (CPU)  
and degrees of freedom  $N$  (number of atoms, electrons, length...)

$T \propto O(N)$	in the best (simplest) cases - linear scaling (classical force fields)
$T \propto O(N^3)$	quantum mechanics - DFT (Matrix diagonalisation and inversion)
$T \propto e^N$	complex problems (Quantum chemistry; multiple minima problems, etc)



# “Complexity” of a Simulation

**physicstoday**

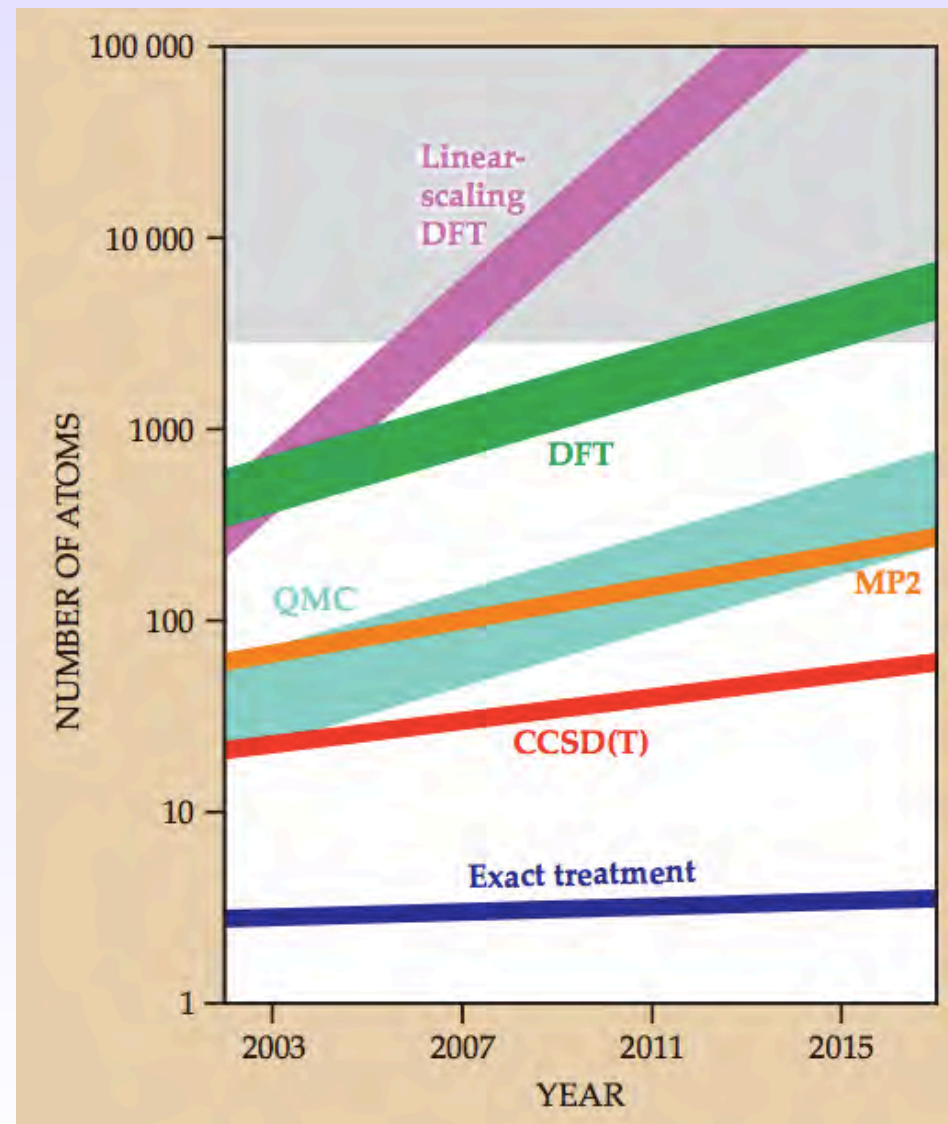
**Chemistry on the computer**

Martin Head-Gordon and Emilio Artacho

feature article

Although exact descriptions of the quantum mechanics of molecules are computationally intractable, chemists and physicists have devised approximations that are efficient enough to be practical and accurate enough to be useful.

April 2008



# Estimate of accessible time and size scales

- Supercomputer with performance:  $F$  Flops (floating point operations per second)
- One week of CPU of the whole computer:  $T_{\text{CPU}} \sim 6 \times 10^5$  seconds
- Number of operations in one week:  $N_{\text{ops}} \sim 6 \times 10^5 \times F$
- Operations in a simulation:  $\#ops \propto C \times N_{\text{at}}^s \times n_t$   
(Typicall,  $C \sim 10^3$  --  $10^6$  floating point operation per MD step)
- $N_{\text{at}} \propto \text{Volume} \propto L^D$  (L = typical length scale, in units of atomic distances)  
 $D = \text{dimension of the system (1,2,3)}$ .
- Time ( $n_t$ ) scales, at least, as L (for information to propagate across the system)  
 $n_t \sim 100 L$

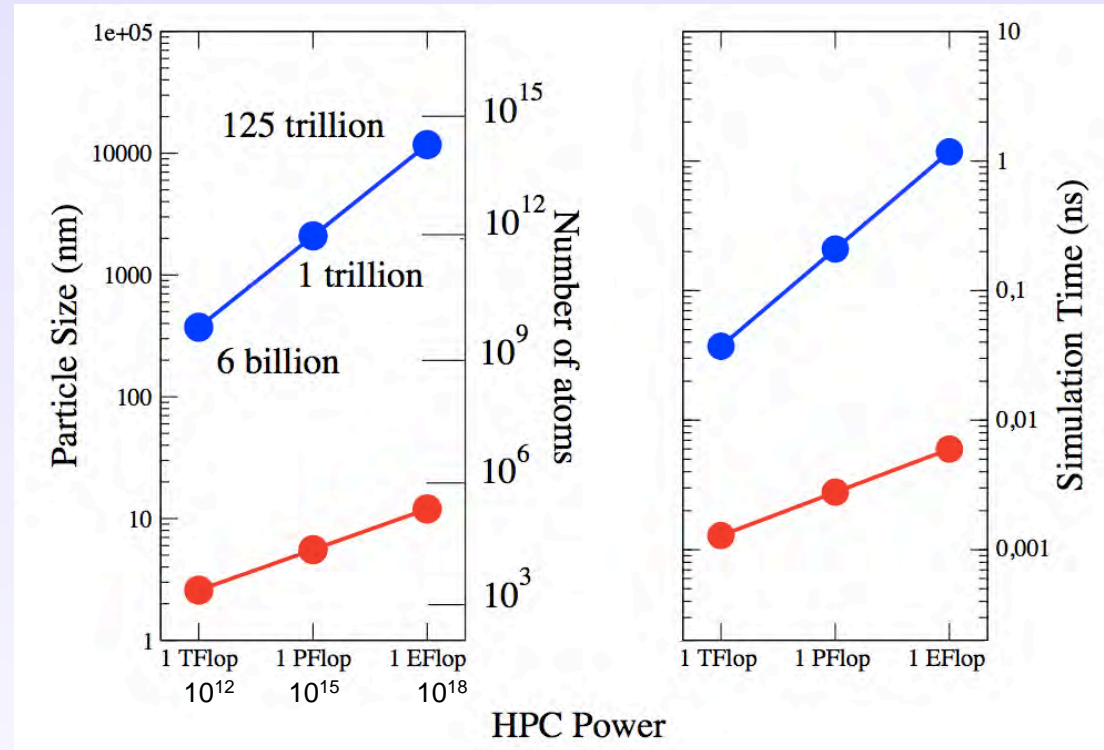
$$N_{\text{at}} \sim F D / (s D + 1)$$
$$n_t \sim L \sim F^{1/(s D + 1)}$$



# Example in 3D system (one week of full usage)

Empirical potentials -  $O(N)$

DFT -  $O(N^3)$



Protein: 10 nm -  $10^5$  atoms  
 Virus: 100 nm -  $10^8$  atoms  
 Cell: 5  $\mu$ m -  $10^{14}$  atoms  
 Grain of salt: 0.5 mm -  $10^{20}$  atoms

- Bridging length scales - Multiscale approaches
- Data analysis and handling becomes a hard problem!
- Time scales: often too short for relevant issues (new methods needed)



## TRILLION-ATOM MOLECULAR DYNAMICS BECOMES A REALITY

TIMOTHY C. GERMANN\* and KAI KADAU†

*Theoretical Division, Los Alamos National Laboratory  
Los Alamos, New Mexico 87545, USA*

*\*tcg@lanl.gov*

*†kkadau@lanl.gov*

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Accepted 6 September 2008

By utilizing the molecular dynamics code *SPaSM* on Livermore's BlueGene/L architecture, consisting of 212 992 IBM PowerPC440 700 MHz processors, a molecular dynamics simulation was run with one trillion atoms. To demonstrate the practicality and future potential of such ultra large-scale simulations, the onset of the mechanical shear instability occurring in a system of Lennard-Jones particles arranged in a simple cubic lattice was simulated. The evolution of the instability was analyzed on-the-fly using the in-house developed massively parallel graphical object-rendering code *MD\_render*.

*Keywords:* Molecular dynamics; BlueGene/L; high performance computing; SPaSM; large-scale; trillion-atom; visualization.



Soler, Artacho, Gale, García, Junquera, Ordejón and Sánchez-Portal  
 J. Phys.: Cond. Matt. **14**, 2745 (2002)

- Self-consistent DFT code (LDA, GGA, new VdW functionals...)

- Pseudopotentials (Kleinman-Bylander)

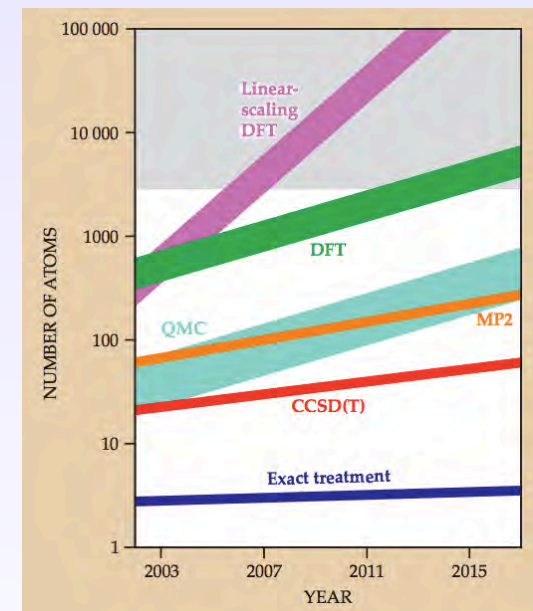
- LCAO approximation:

Basis set:

Confined Numerical Atomic Orbitals  
 (Sankey's "fireballs")

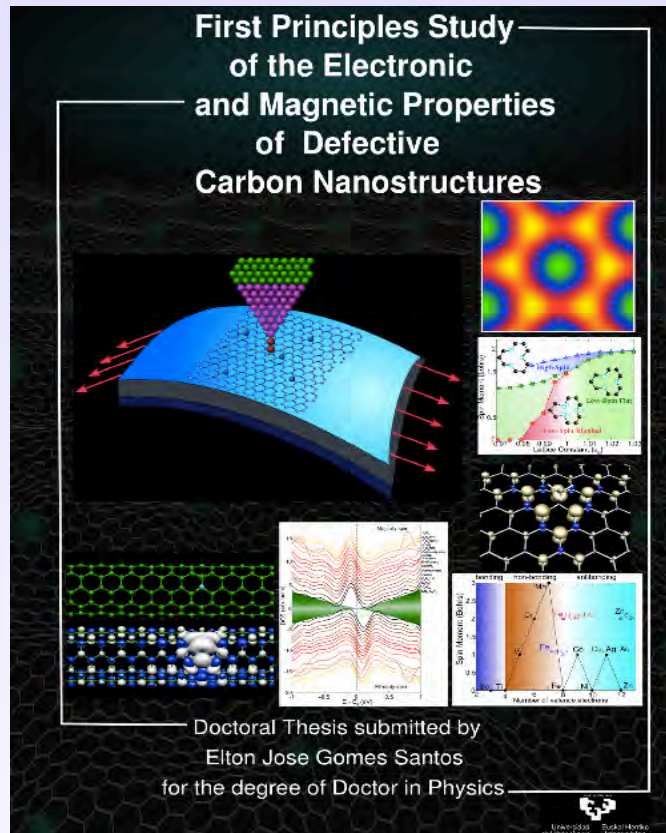
**As complete as needed**

- Order-N methodology (in the calculation of the DFT Hamiltonian and --if required-- in the solution of the eigenvalue equation to obtain the WFs)

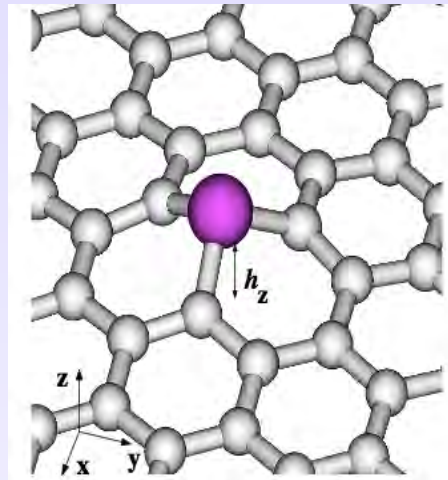




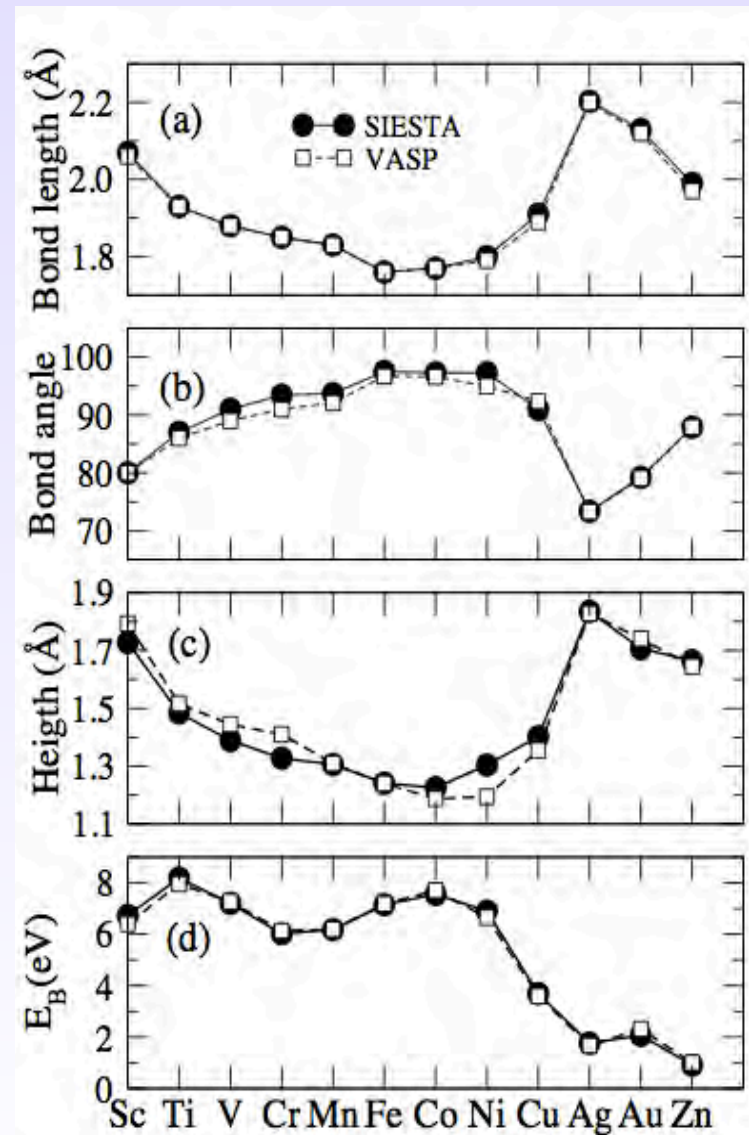
# Example of Accuracy of standard DZP bases (in graphene)



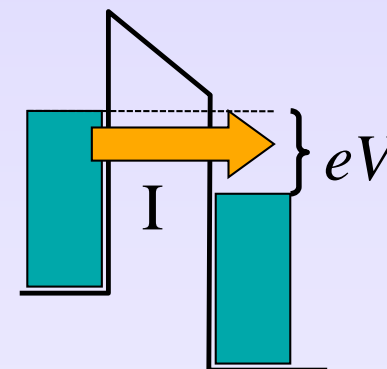
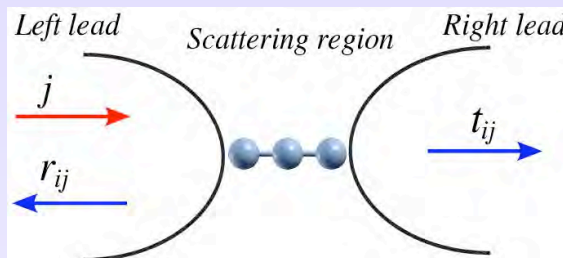
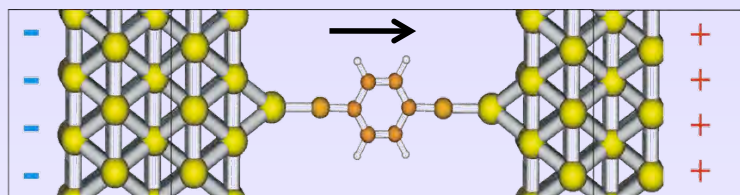
- DZP Basis
- $E_{\text{shift}} = 50 \text{ meV}$
- $r_c$  of TM increased to obtain converged  $E_B$  (variationally)



	$r_{sp}^{NAO} (a_0)$	$r_d^{NAO} (a_0)$
Co	8.00	4.73
Ni	10.94	6.81
Cu	8.87	5.52
Ag	10.48	6.52
Au	8.63	6.08
Zn	9.24	5.33



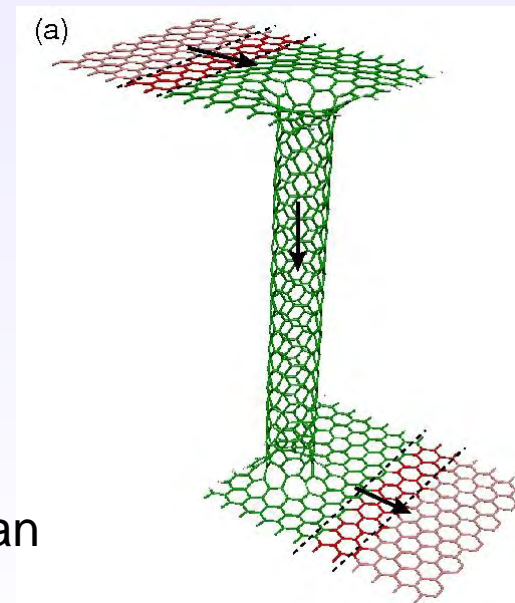
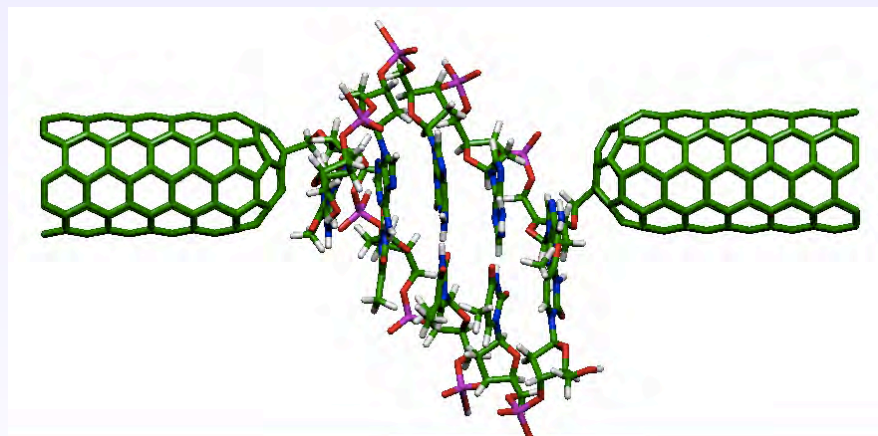
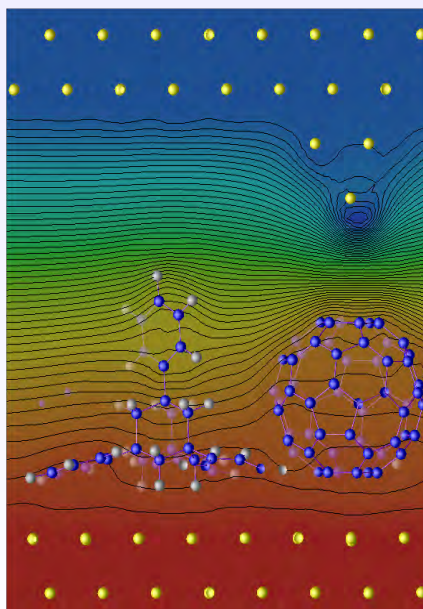
# Electronic Transport from Scattering Theory (Buttiker-Landauer)



## Atomistic; first-principles: DFT + NEGF's -- TranSIESTA

Brandbyge, Mozos, Ordejón, Taylor, Stokbro,  
PRB 65, 165401 (2002)

$$I = \frac{2e^2}{h} \int d\varepsilon (f_L(\varepsilon) - f_R(\varepsilon)) T(\varepsilon)$$



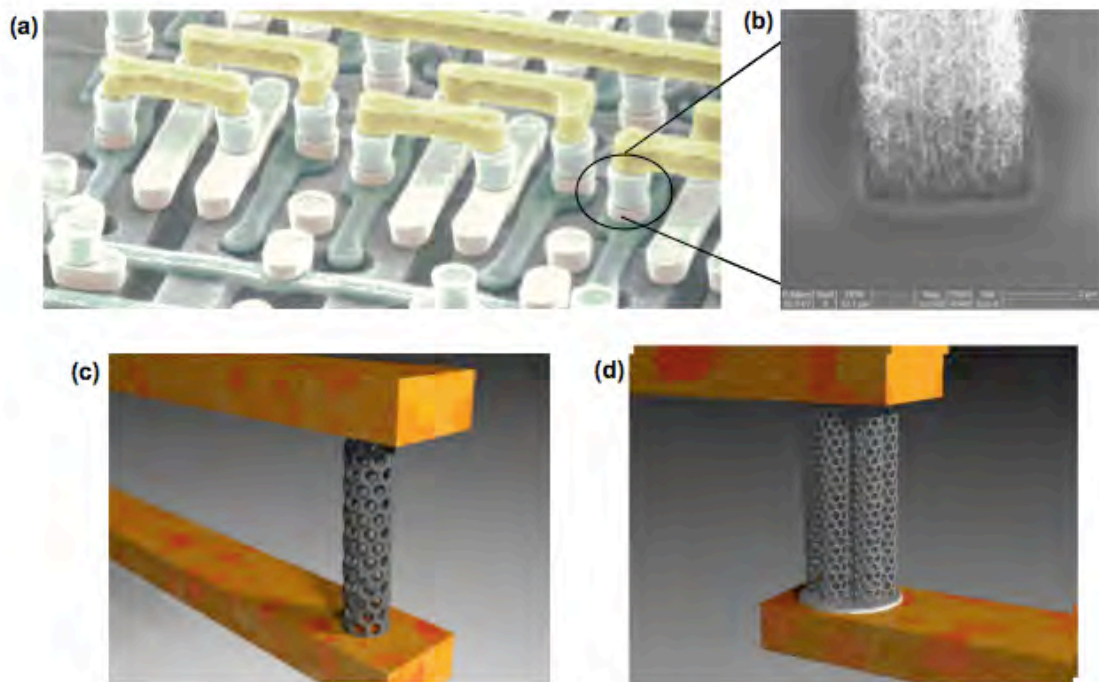
(Other similar packages like SMEAGOL can also be linked to SIESTA)

# An example: Graphene layers bridged by CNTs

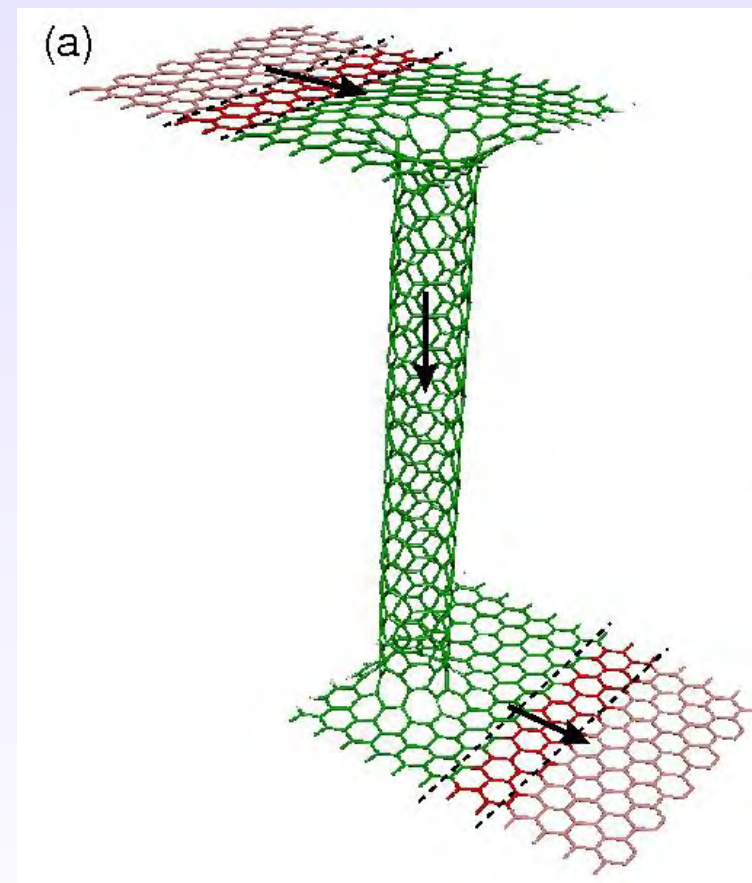
Novaes, Rurali, Ordejón, ACS Nano 4, 7596 (2010)

516

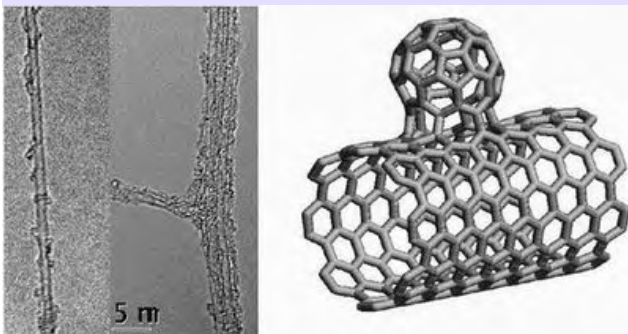
M P Anantram and F Léonard



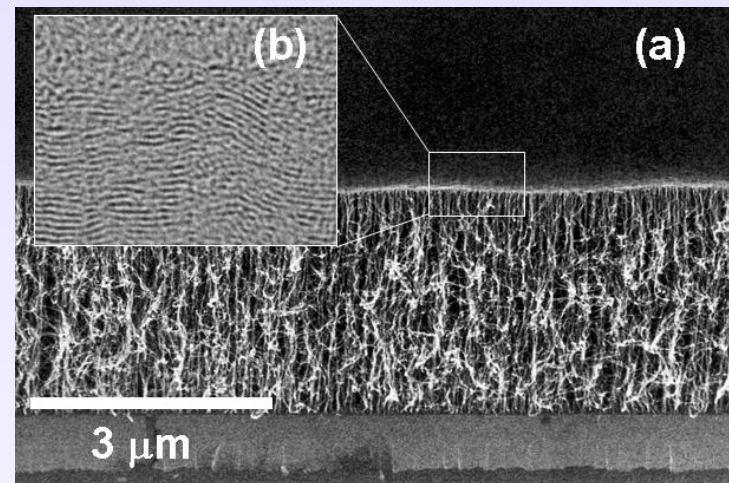
**Figure 8.** (a) A pictorial representation of the wiring in an integrated circuit. The horizontal interconnects are shown in yellow and the vertical interconnects are shown in grey. (b) An example of a MWNT array grown in a silicon oxide via, which can potentially be used as a vertical interconnect provided excellent electrical contacts can be made to both the top and bottom of the nanotube array. (c) A pictorial representation of the limit where a SWNT is used as a vertical interconnect in what may eventually become a molecular circuit. (d) An interconnect based on a bundle of SWNTs will have a low bias resistance of  $6.5 \text{ k}\Omega$  divided by the number of nanotubes. (Source: (a) IBM Journal of Research and Development, (b) from [Kre02], (c) and (d) courtesy of Infineon Technologies.)



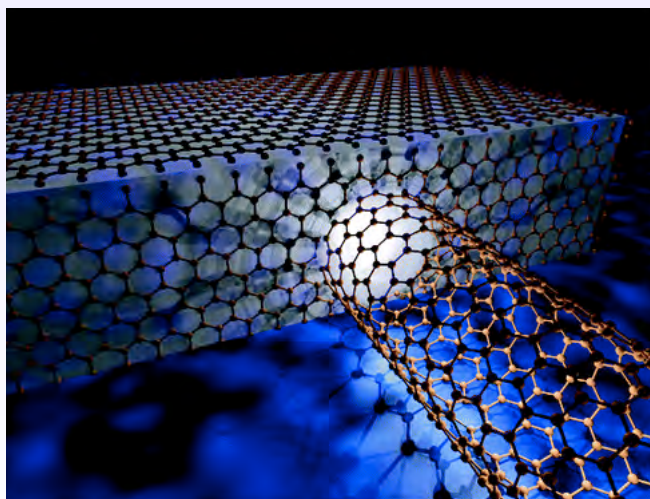
# Related structures



Carbon “Nanobuds”  
(nanotubes with fullerenes covalently attached)



Nanotube/Graphite composite  
D. Kondo et al., Appl. Phys. Express 1, 074003 (2008)



## Graphitic Electrical Contacts to Metallic Single-Walled Carbon Nanotubes Using Pt Electrodes

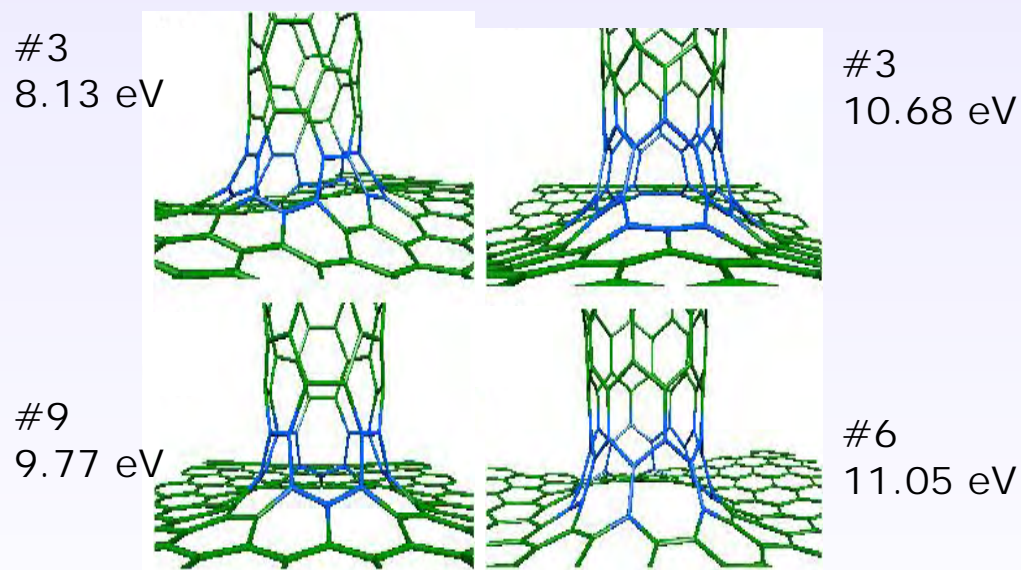
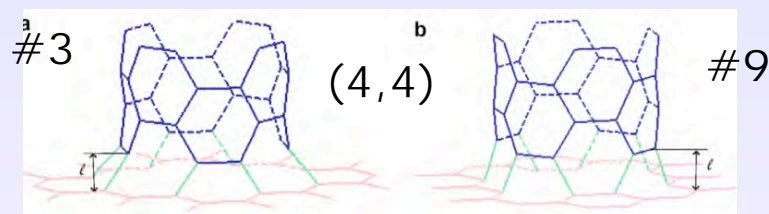
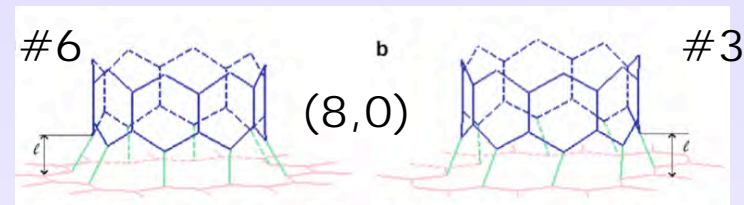
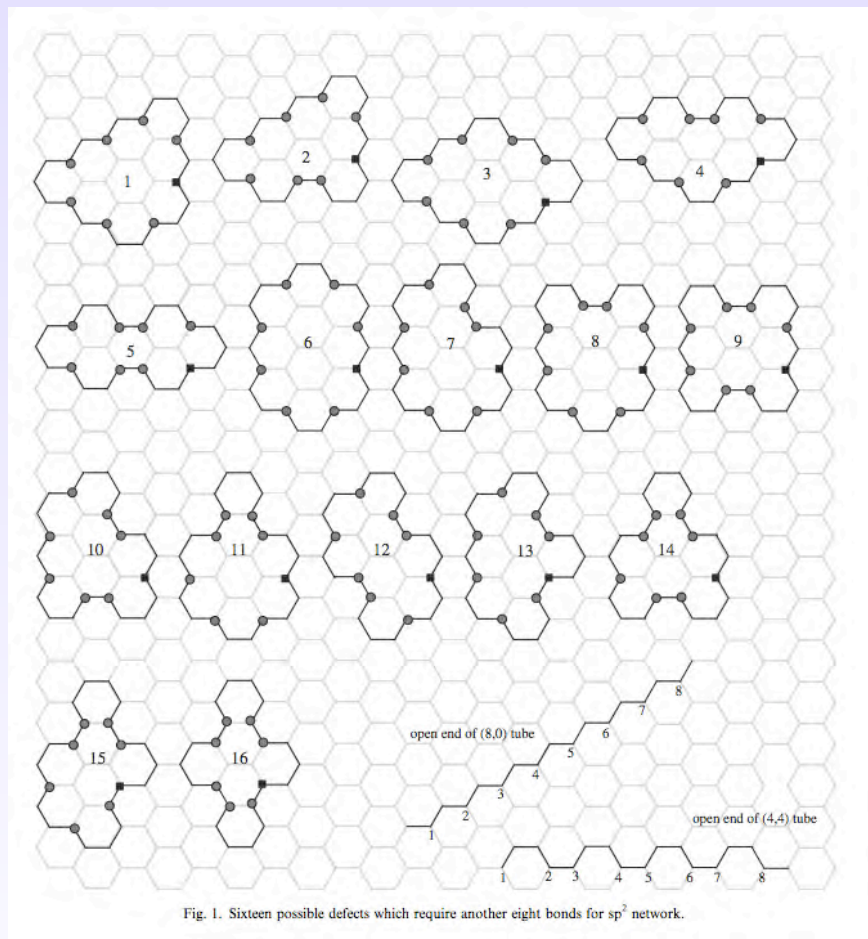
Alexander A. Kane,<sup>†</sup> Tatyana Sheps,<sup>†</sup> Edward T. Branigan,<sup>‡</sup> V. Ara Apkarian,<sup>‡</sup>  
Ming H. Cheng,<sup>‡</sup> John C. Hemminger,<sup>‡</sup> Steven R. Hunt,<sup>†</sup> and Philip G. Collins<sup>\*†</sup>

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**2009  
Vol. 9, No. 10  
3586-3591**

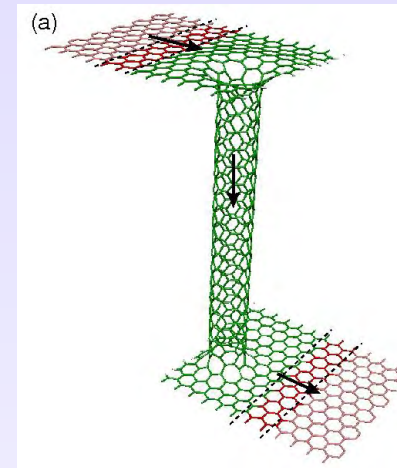
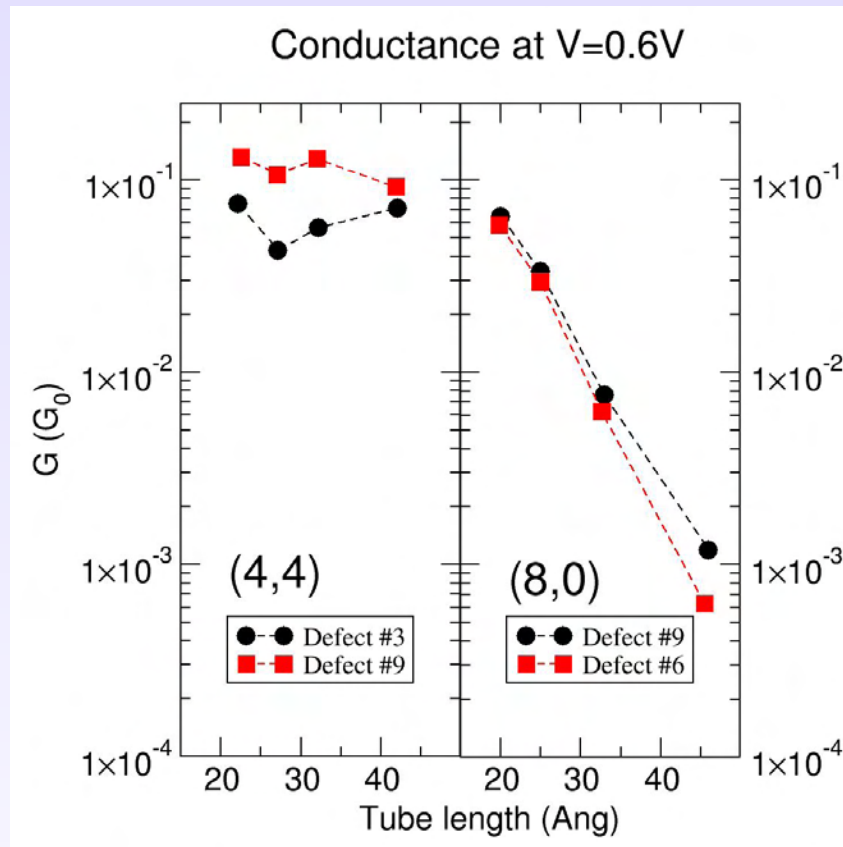
# Covalent link of CNT's to graphene

Baowan, Cox and Hill, Carbon 45, 2972 (2007)



GGA (PBE); DZP Basis set

# Covalent link of CNT's to graphene

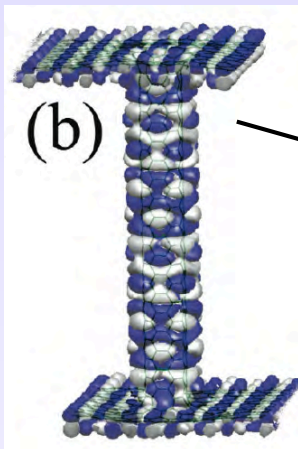


$$G = \frac{I}{V} = \frac{G_0}{V} \int_{-V/2}^{V/2} d\varepsilon T(\varepsilon)$$

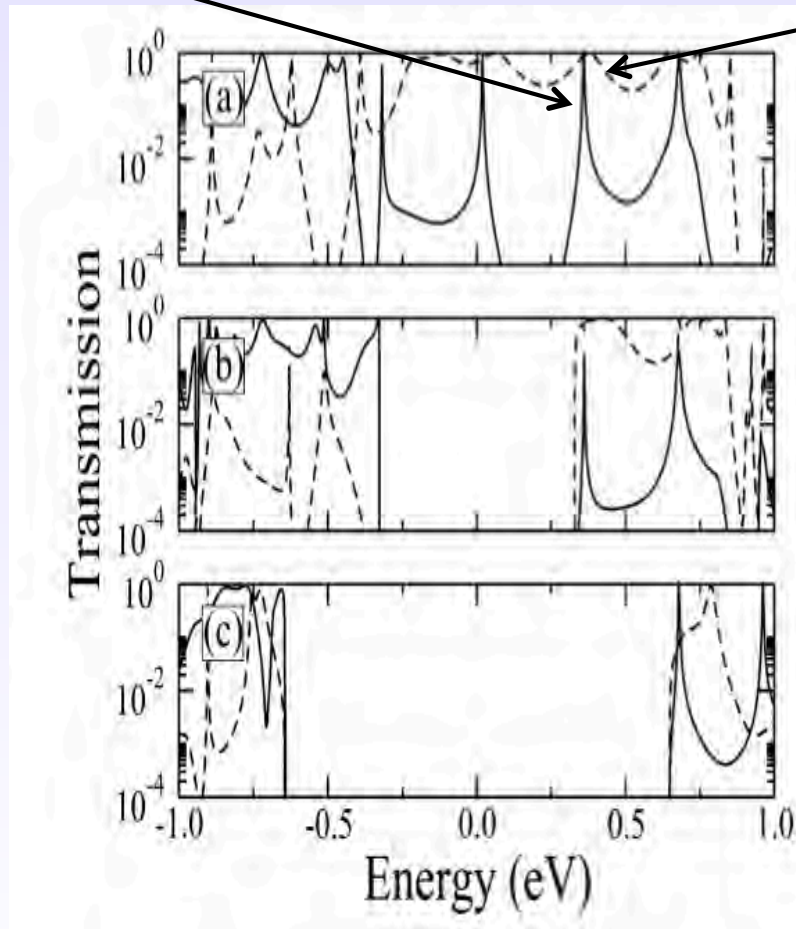
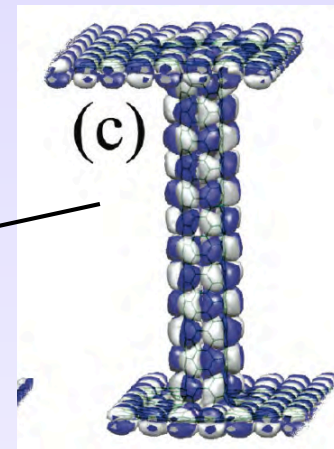
Metallic tubes: Extended states → G is roughly independent of tube length

Semiconducting tubes: No states in the gap. Conduction by tunneling  
 → G decreases exponentially with tube length

# (k-resolved) Transmission Curves - Eigenchannel analysis

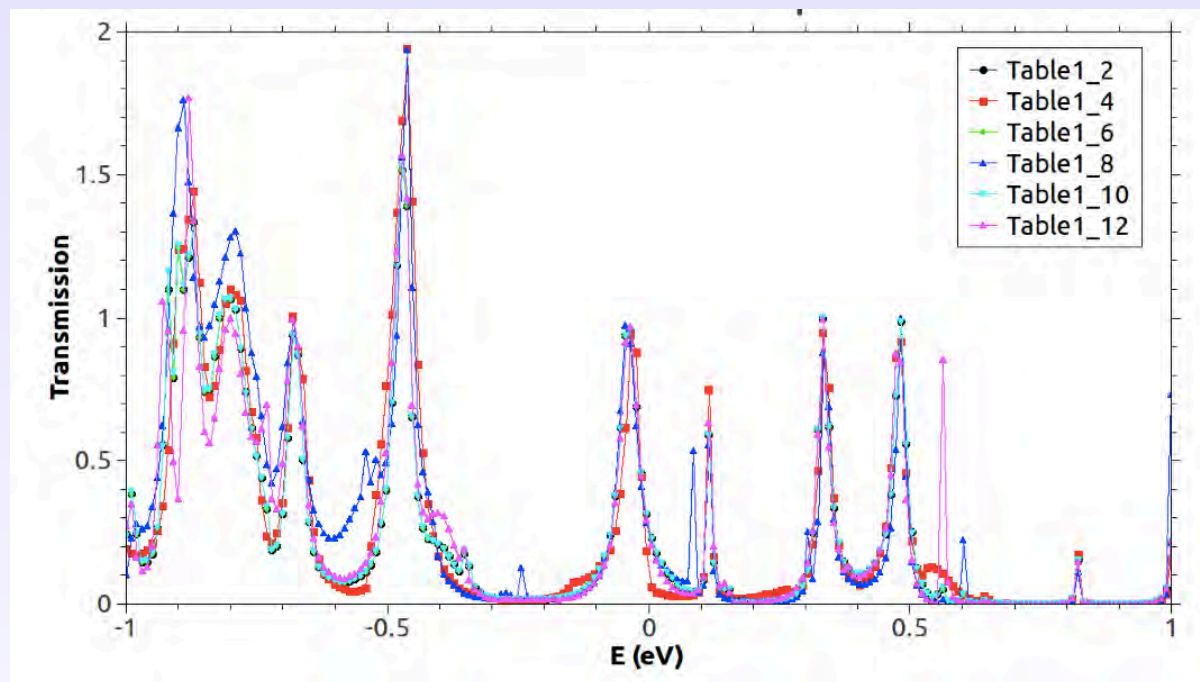
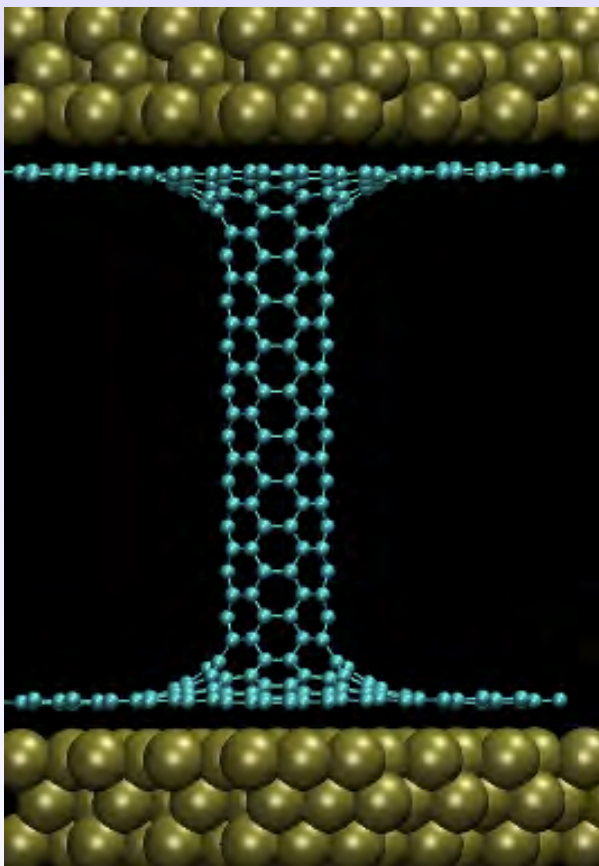


(8,0) CNT



- CNT  $\pi$  and  $\pi^*$  states couple differently to graphene
- Large (0.2 eV) band offset between CNT and graphene
- Influence of link structure on the band offset (specially for semiconducting CNTs).

# Pt / Graphene /CNT contacts

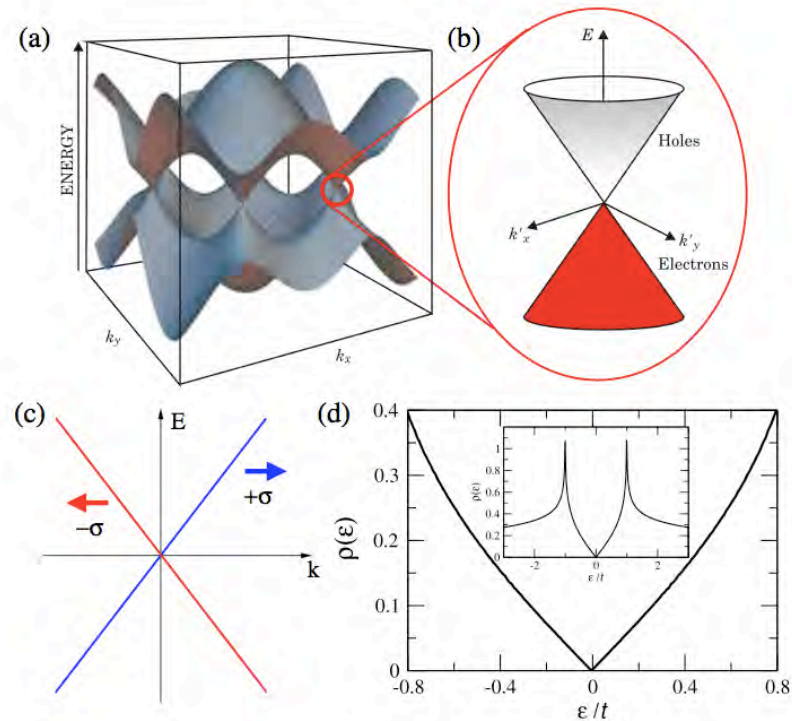
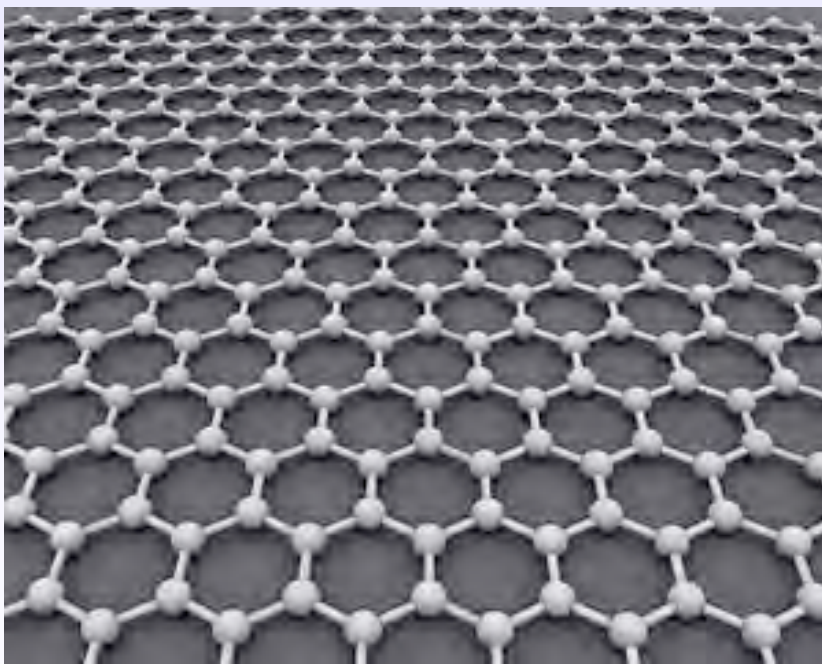


- Resonant transmission through the electronic states of the (short) CNT
- The presence of graphene does not seem to improve the coupling between CNT and Pt



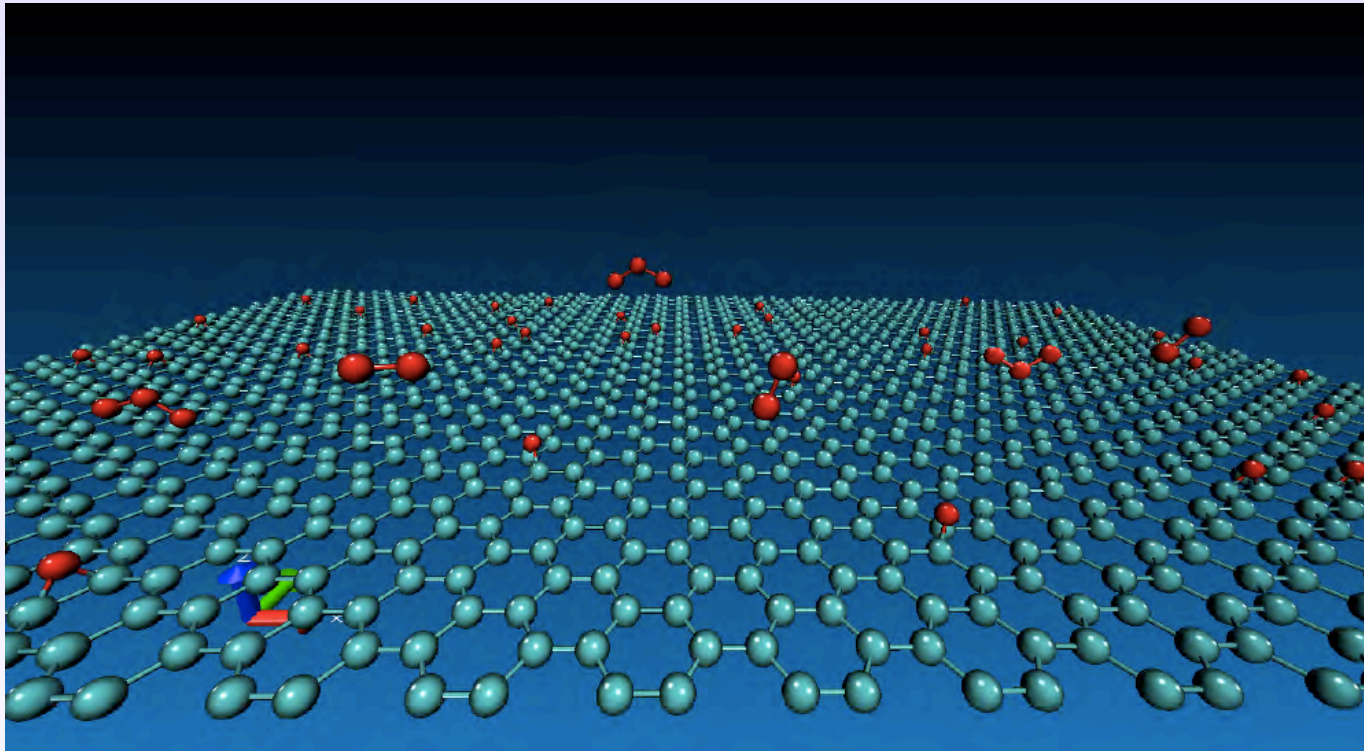
# Graphene

- One-atom thick  $sp^2$  carbon material
- Many interesting physical properties (electronic, optical, mechanical, etc)
- Linear dispersion relations (electrons behave as massless Dirac Fermions)
- Zero-gap semiconductor
- Very large mobility (excellent for electronic devices)
- **Modifying the properties via chemical functionalization?**



## Transport in chemically - modified graphene:

- Much larger scales involved: Very high mobility and mean free paths (microns!)
- Accurate description of effects of chemicals required, but straight DFT is not feasible!
- Intrinsic transport properties, instead of contact characteristics --> Landauer is not the best choice



- Experimentally: Ozone exposure (J. Moser, H. Tao, S. Roche, F. Alzina, C. M. Sotomayor Torres, and A. Bachtold, PRB 81, 205445 (2010))
- Exploring the possibility of driving a strong localization regime by introducing Oxygen impurities

## DFT

*Ab initio* calculations to describe the local potential induced by the impurity



## DFT → TB

Extract sufficient TB parameters to reproduce the local potential



## TB-parametrized Kubo Formalism

Allows us to simulate mesoscopic-sized systems ( $10^6$  atoms) :

- ▶ comparison with experiment
- ▶ calculate transport properties to visualize quantum effects

# Kubo-Greenwood calculation for transport (Linear response; Fluctuation-dissipation)

## Kubo conductivity

$$\sigma_{DC} = \frac{1}{2} e^2 \rho(E_F) \lim_{t \rightarrow \infty} \frac{\partial}{\partial t} \Delta X^2(E_F, t)$$

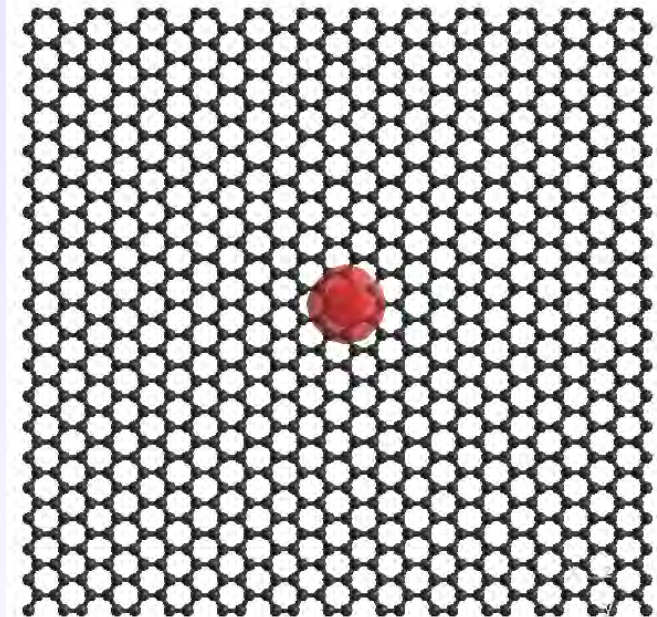
## Wave packet : mean quadratic displacement

$$\Delta X^2(E, t) = \frac{\text{Tr} \left[ [\hat{X}, \hat{U}(t)]^\dagger \delta(E - \hat{H}) [\hat{X}, \hat{U}(t)] \right]}{\text{Tr} \left[ \delta(E - \hat{H}) \right]}$$

## Diffusion coefficient

$$D_x(t) = \frac{\Delta X^2(t)}{t}$$

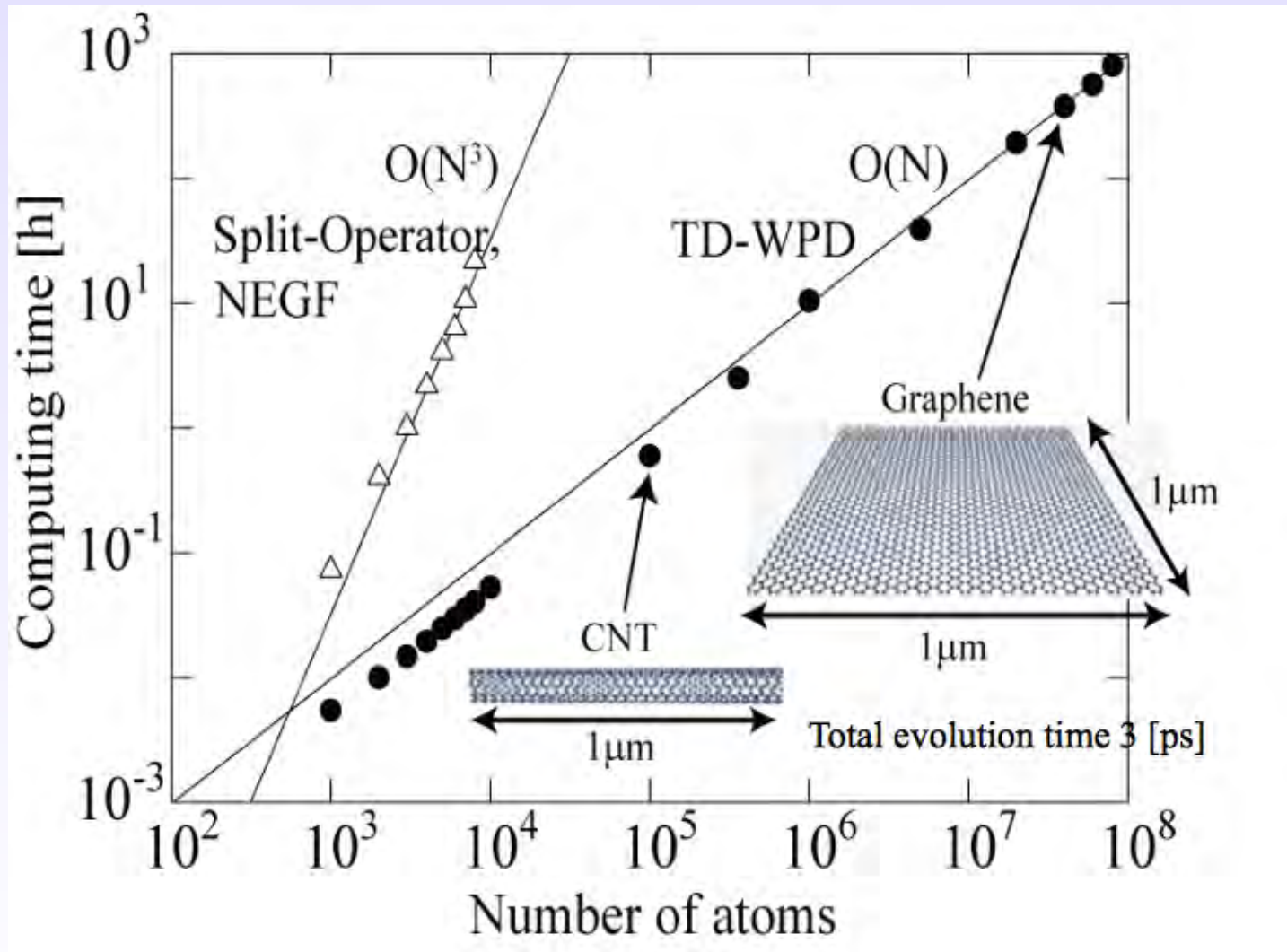
$$\hat{U}(t) = \prod_{n=0}^{N-1} \exp(i\hat{H}(n\Delta t)\Delta t/\hbar)$$



S. Roche, PRB'99

Lherbier, A.; Biel, B.; Niquet, Y.-M.; Roche, S. *Phys. Rev. Lett.* **2008**, *100*, 036803.

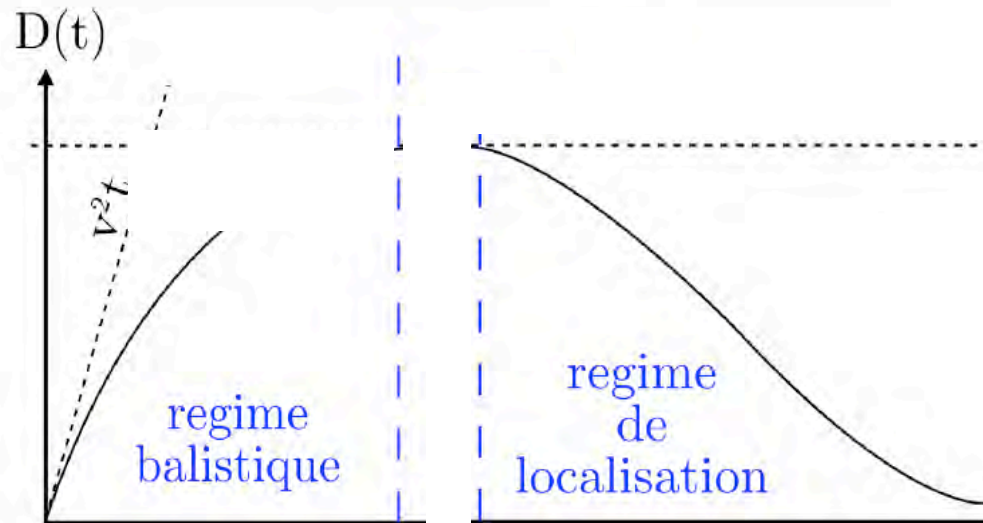
# Kubo-Greenwood calculation for transport (S. Roche, CIN2)



# Kubo-Greenwood calculation for transport

## Diffusion Coefficient

$$D_x(t) = \frac{\Delta X^2(t)}{t}$$



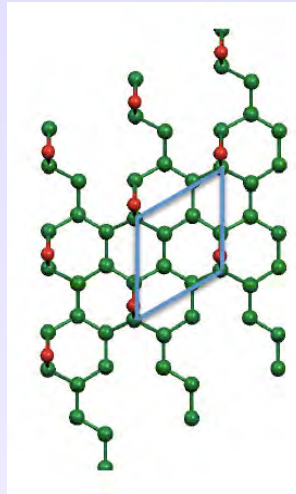
**Scattering (defects,...)  
& Disorder**

**Quantum interference  
Anderson Localization**

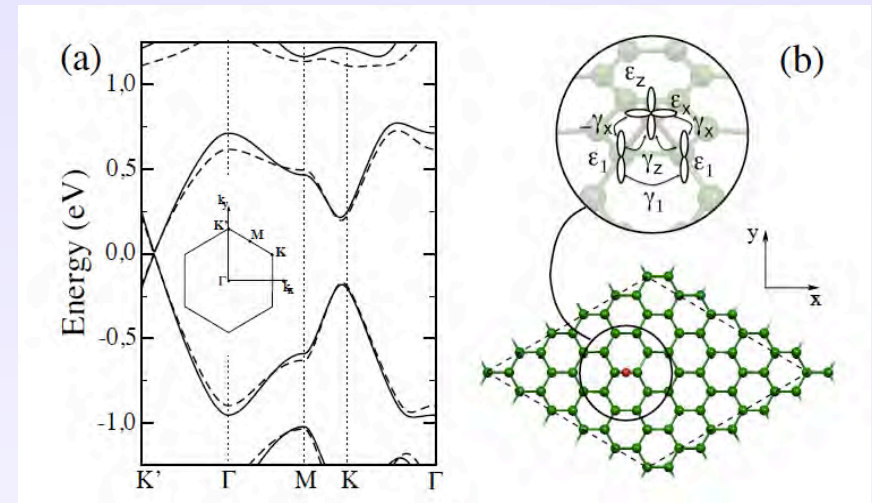


# Epoxide - Functionalized graphene -- “Poor-man’s” multiscale approach: Combining approaches to reach relevant sizes and properties

## 1. DFT for small systems



## 2. Tight-Binding model that reproduces the DFT results

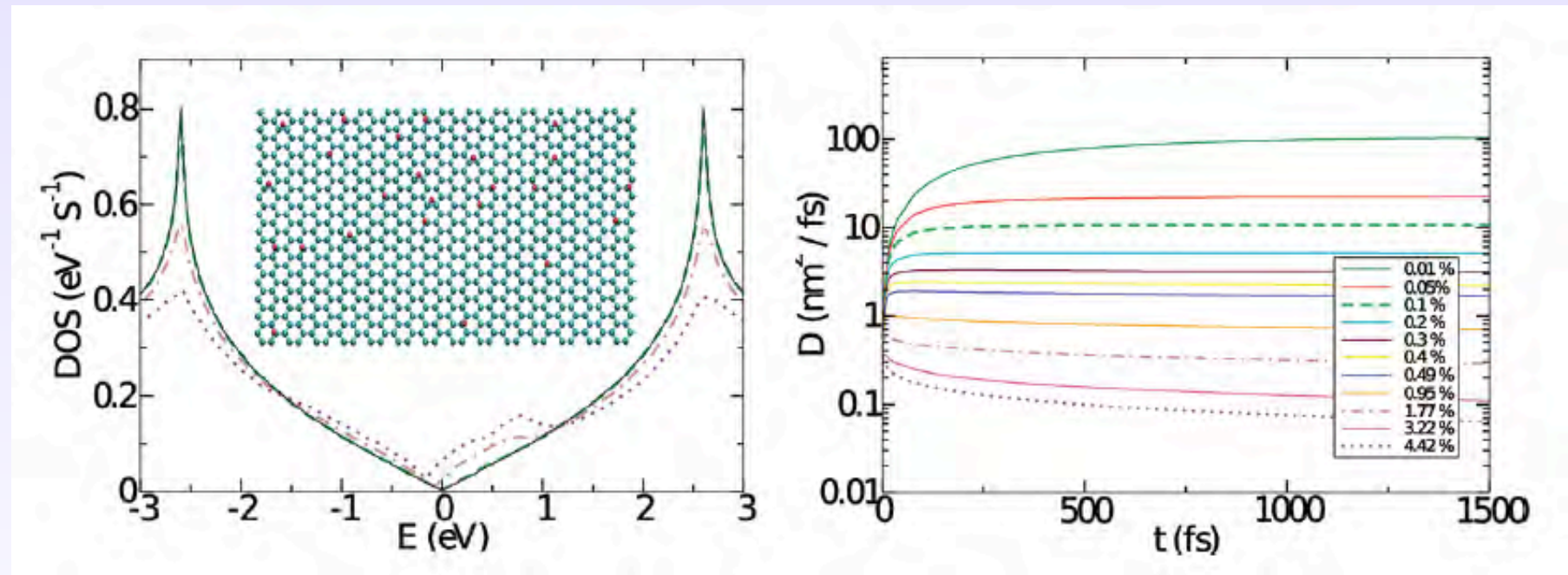


## 3. Kubo approach: conductance for mesoscopic systems ( $10^6$ atoms) (within the TB model)

Based on wave-packet propagation

Kubo results from TB model derived from ab-initio  
N. Leconte, A. Lherbier, J.C. Charlier - U.C. Louvain  
S. Roche, CIN2

Diffusion coefficient at the Fermi level

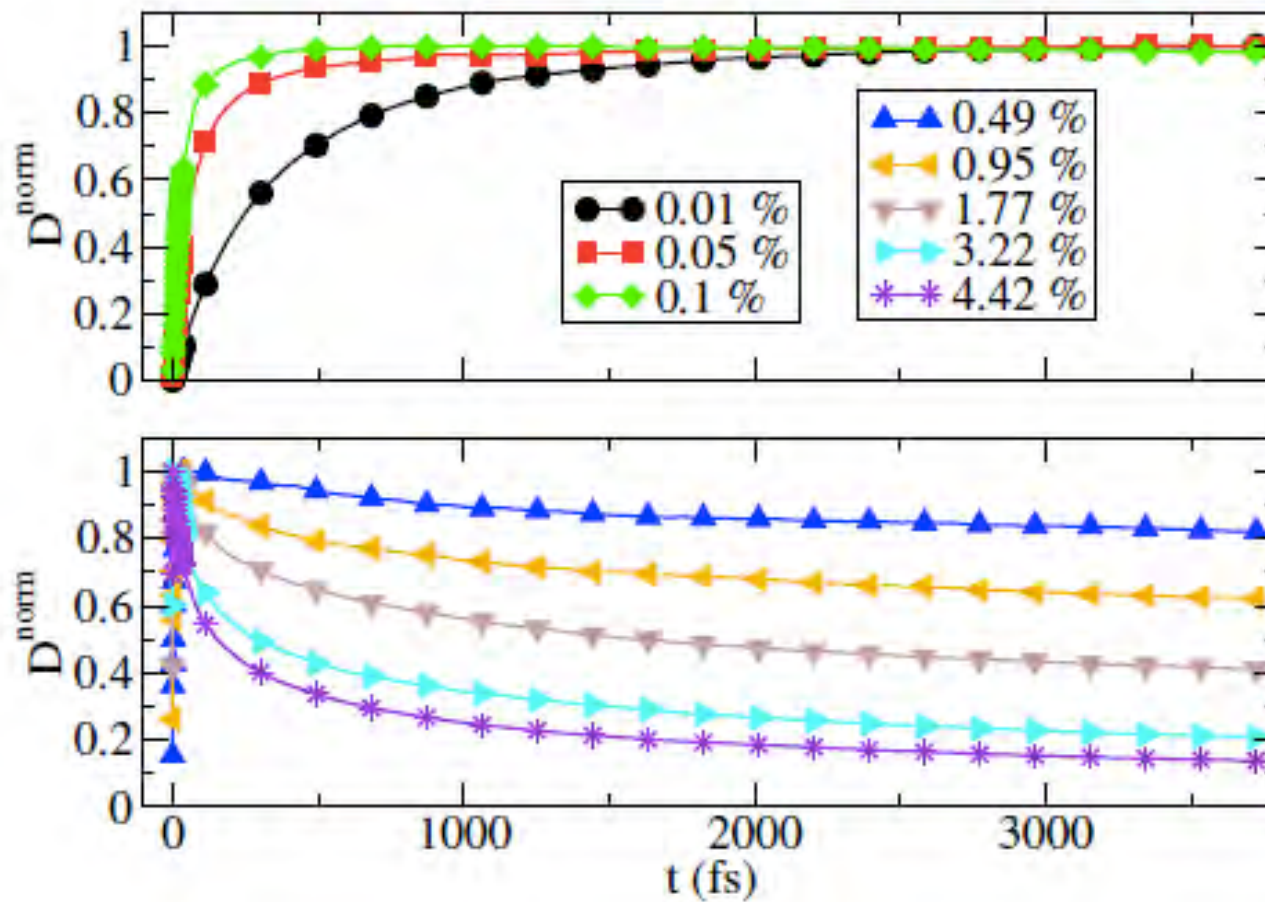


Leconte et al., ACS Nano, 4, 4033 (2010)



# Evidence for localization, for relatively small concentration

Diffusion coefficient at the Fermi level



**Diffusive**

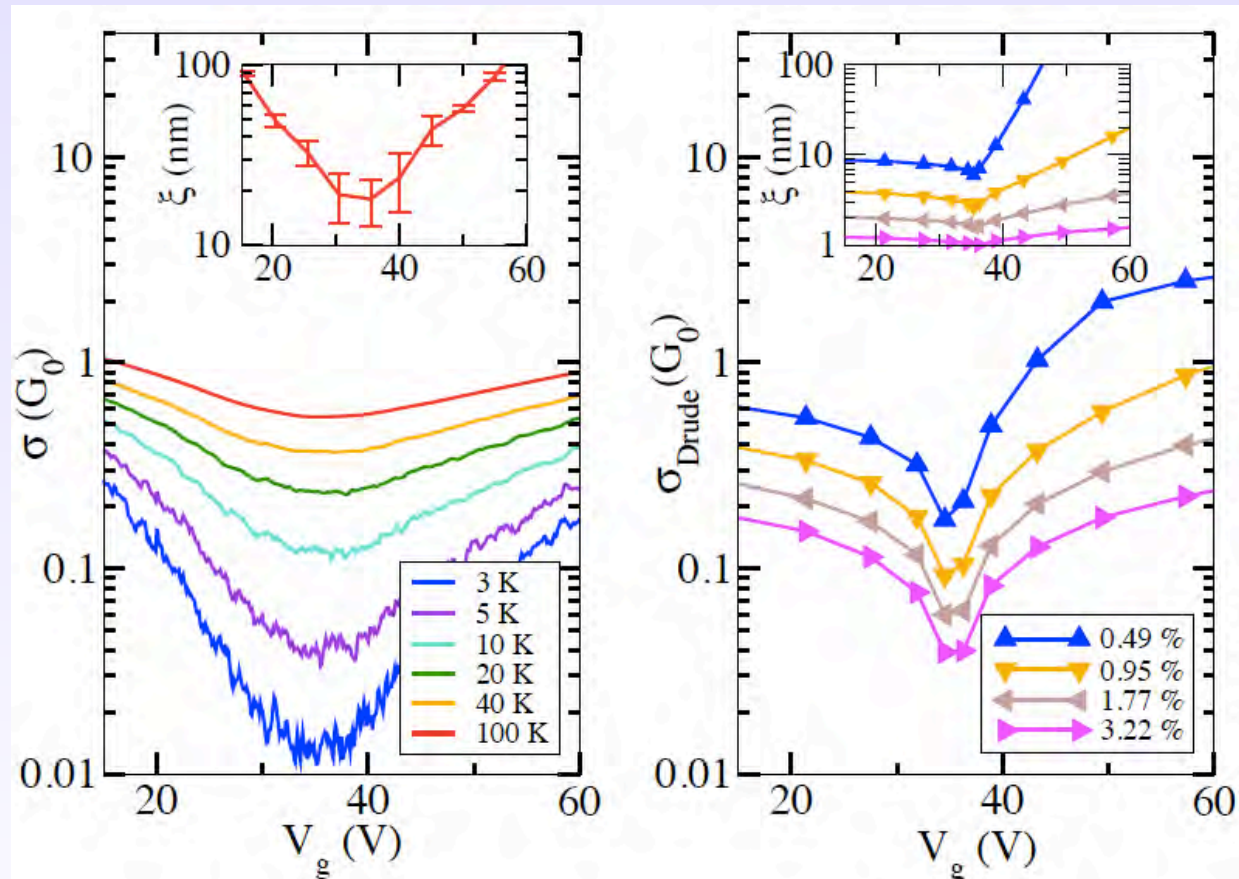
(but Mean Free Path similar to simulation cell size)

**Localization**

Leconte et al., ACS Nano, 4, 4033 (2010)



# Comparison with experiments (A. Bachtold, C. Sotomayor - CIN2)



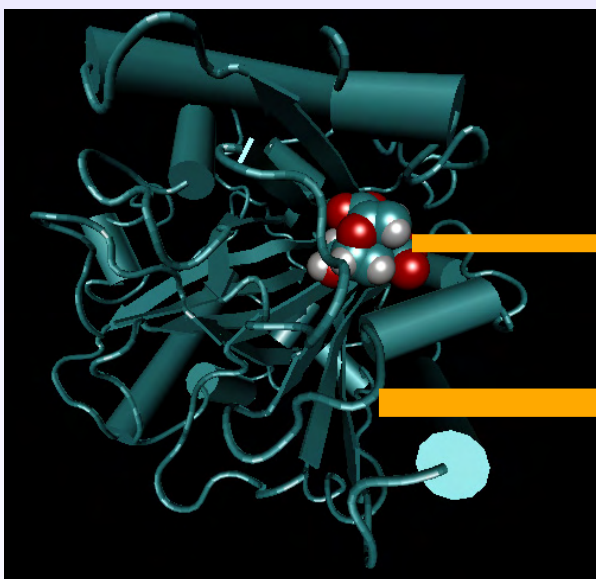
PRB 81, 205445 (2010)



# Beyond First-Principles for structure/dynamics: Hybrid QM-MM schemes for local reactivity in complex systems

Issues:

- Reactions in active sites of proteins
- Effects of solvents
- Long dynamics for floppy modes (MM)
- Similar methods for non-bio systems



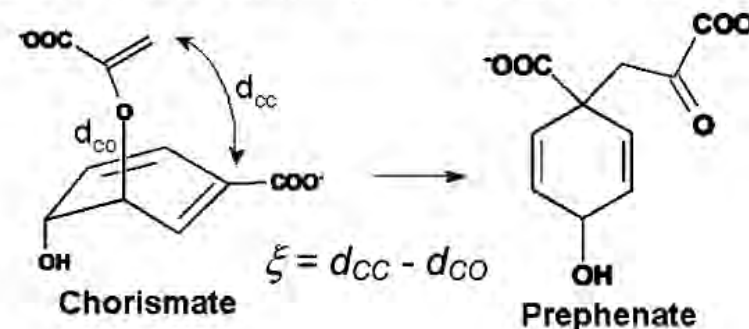
Reactive subsystem: QM

Environment: MM (AMBER)

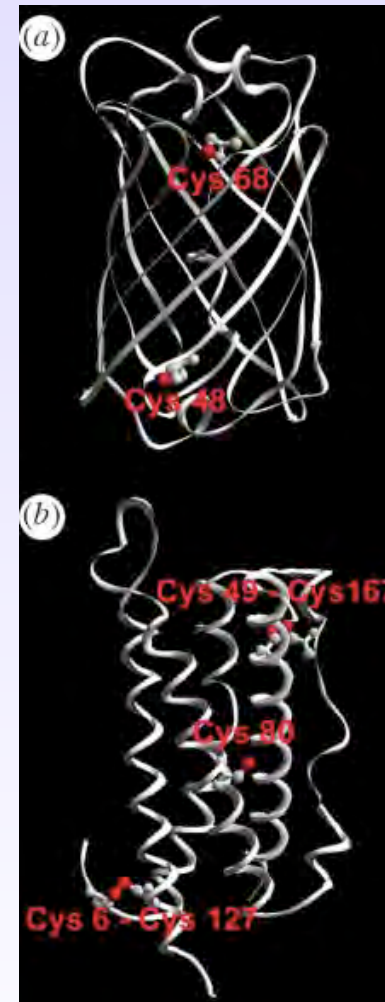
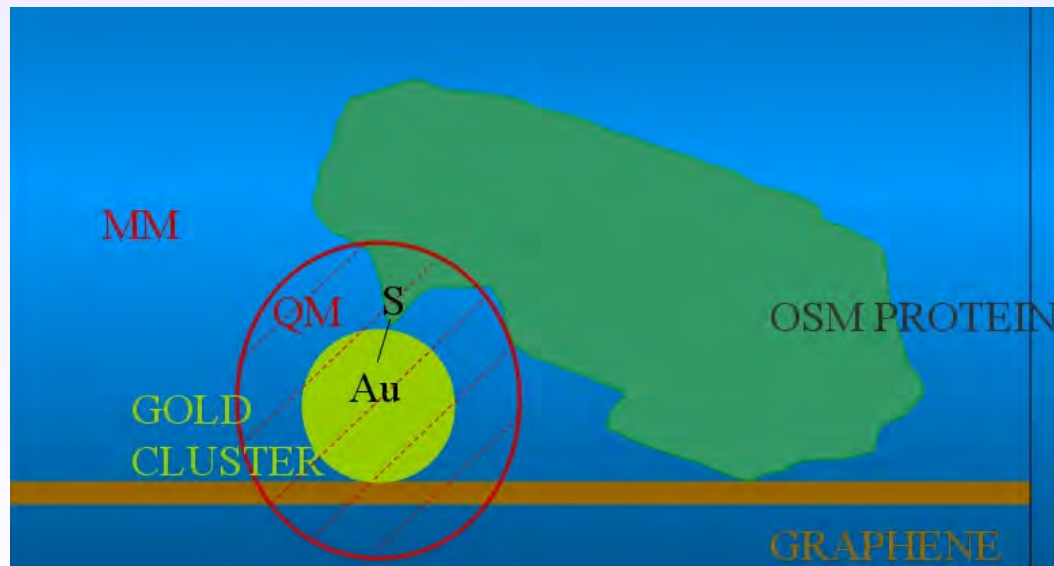
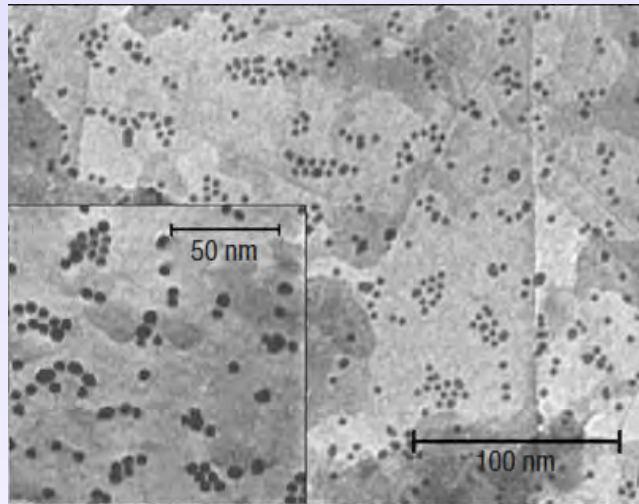
Crespo, Martí, Scherlis, Ordejón Roitberg and Estrín  
J. Phys. Chem. B, **107**, 13728 (2003)

Sanz et al., Theor Chem Acc **128**, 825 (2011)

Scheme 1. Chorismate to Prephenate Conversion Reaction



# Protein immobilization on Graphite by Gold Nanoclusters (Carlos Sanz, in collaboration with Richard Palmer, Birmingham)

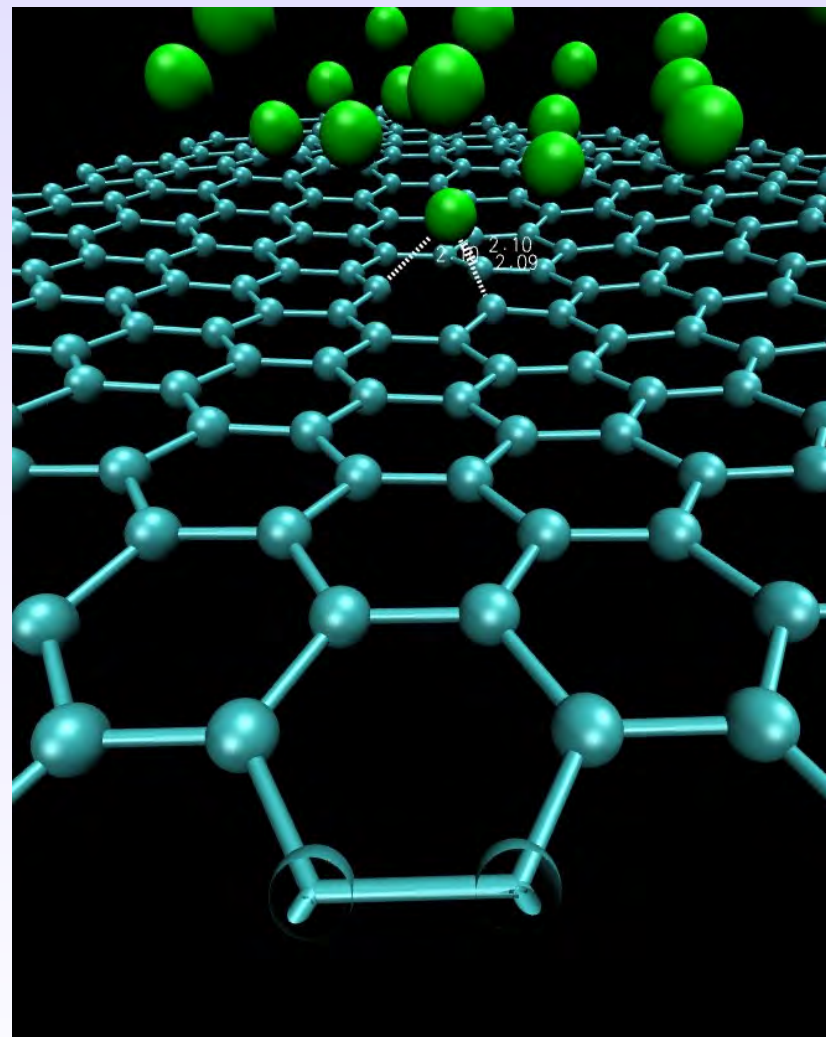
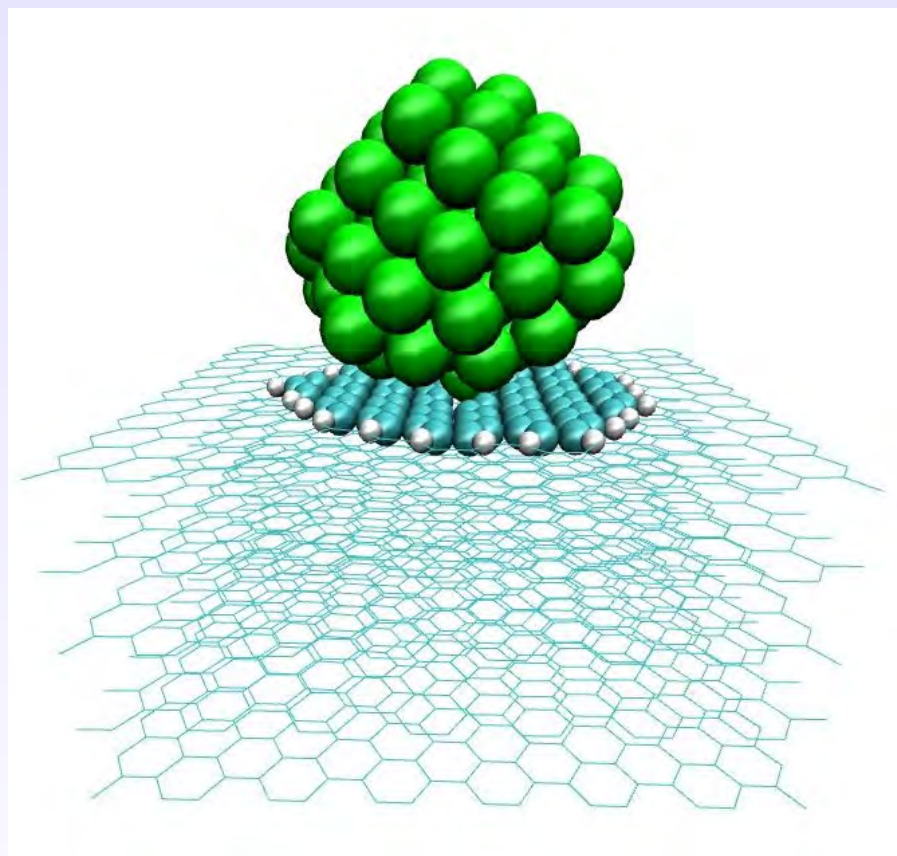


GFP  
(Green  
fluorescent  
protein)

OSM  
(Human  
oncostatin M)



# Gold nanoclusters on Graphite: QM/MM Simulations (Carlos Sanz)



# What is the structure of the free clusters?

VOLUME 81, NUMBER 8

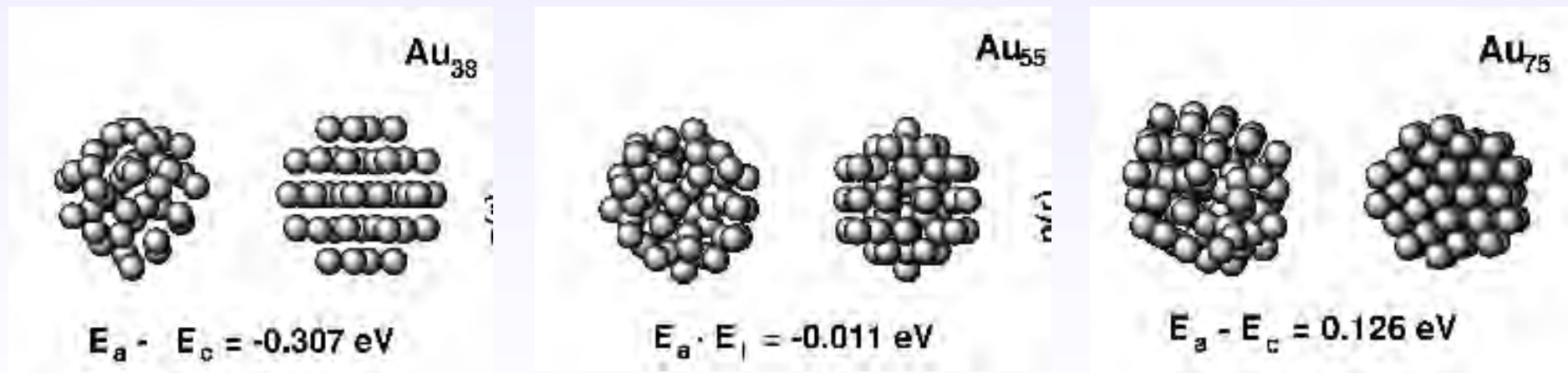
PHYSICAL REVIEW LETTERS

24 AUGUST 1998

## Lowest Energy Structures of Gold Nanoclusters

I.L. Garzón,<sup>1</sup> K. Michaelian,<sup>1</sup> M.R. Beltrán,<sup>2</sup> A. Posada-Amarillas,<sup>3</sup> P. Ordejón,<sup>4</sup> E. Artacho,<sup>5</sup>  
D. Sánchez-Portal,<sup>5</sup> and J.M. Soler<sup>5</sup>

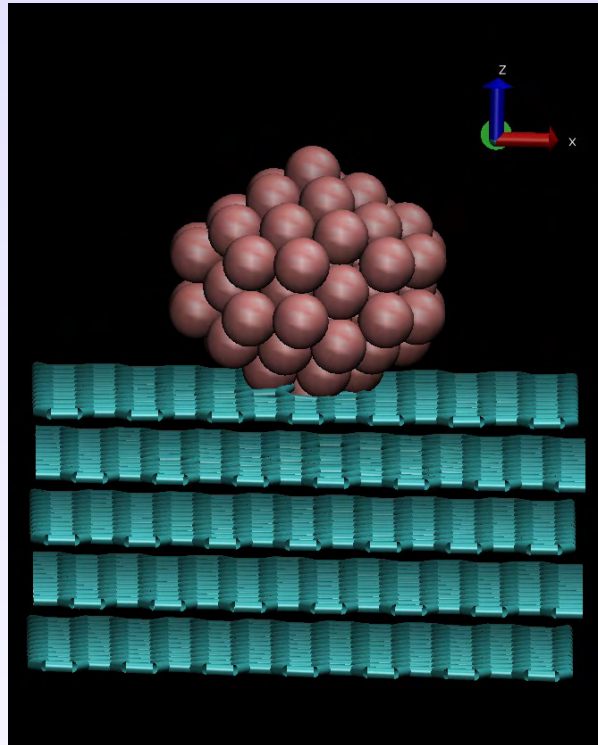
The lowest energy structures of  $Au_n$  ( $n = 38, 55, 75$ ) nanoclusters are obtained by unconstrained dynamical and **genetic-symbiotic optimization methods**, using a Gupta  $n$ -body potential. A set of amorphous structures, nearly degenerate in energy, are found as the most stable configurations. Some crystalline or quasicrystalline isomers are also minima of the cluster potential energy surface with similar energy. First principles calculations using density functional theory confirm these results and give different electronic properties for the ordered and disordered gold cluster isomers.



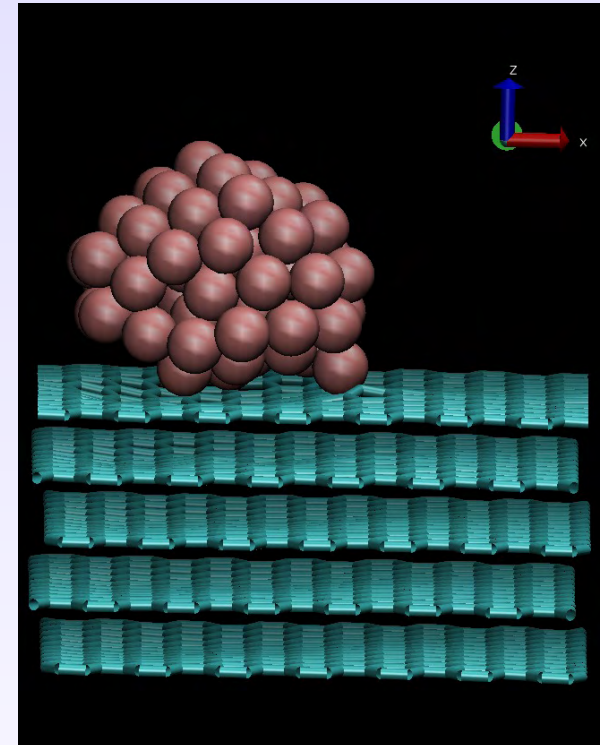
# Gold nanoclusters on Graphite: QM/MM Simulations (Carlos Sanz)

Au<sub>75</sub>

INITIAL



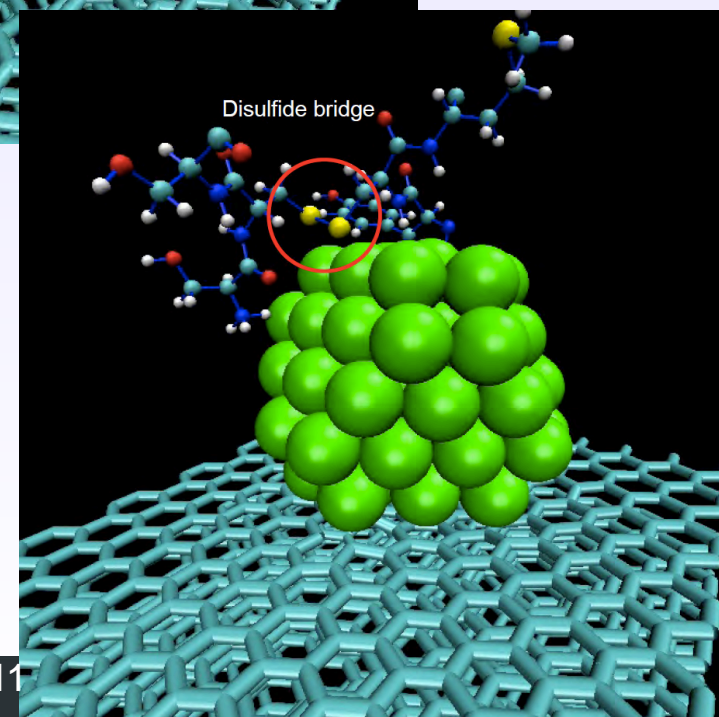
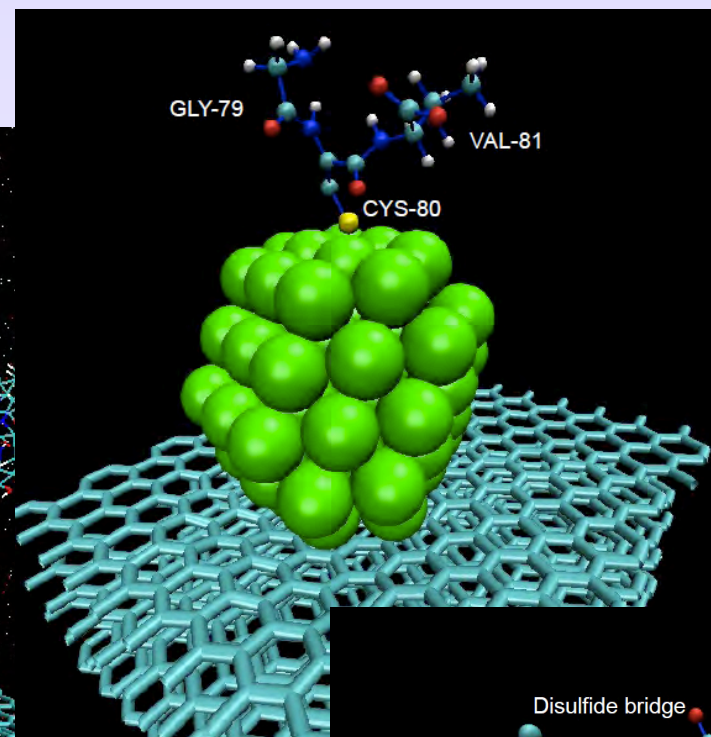
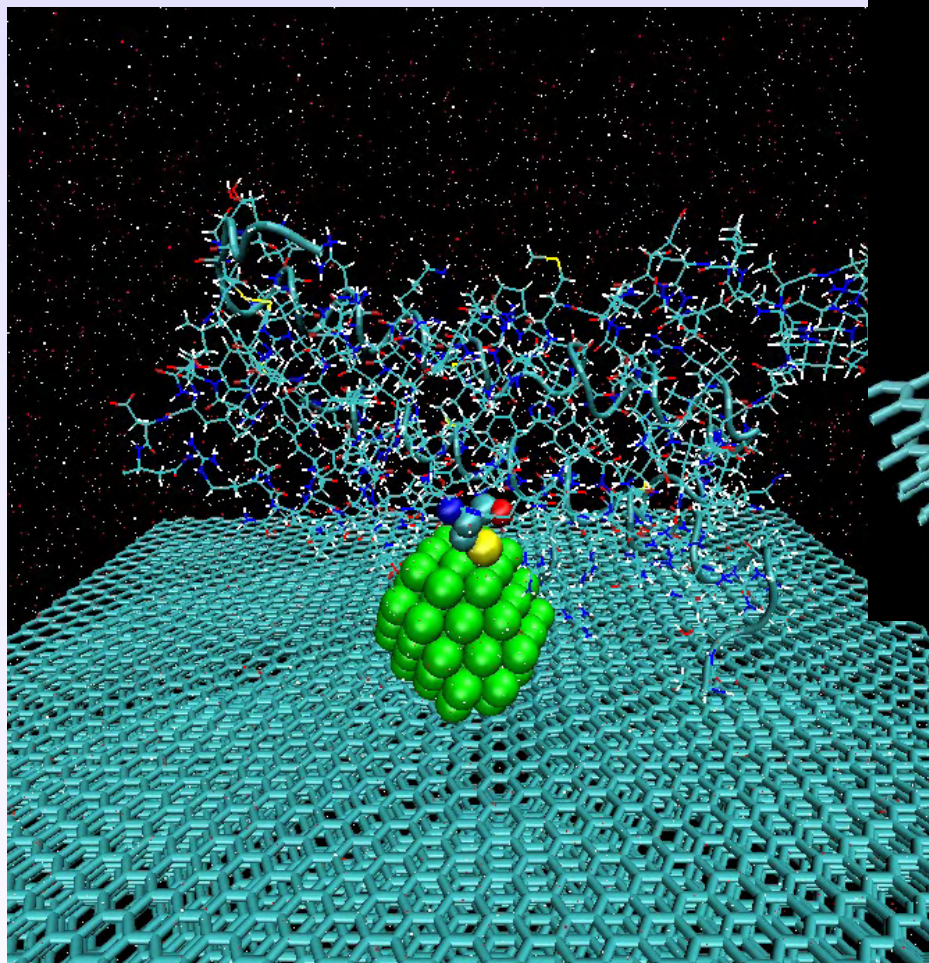
FINAL



- Strong rearrangement upon adsorption on the graphite surface
- Energetic ordering of the structures changes on the surface with respect to the free cluster
- 'Soft modes' present (rotations, shear, ...) which make the relaxations very time-consuming



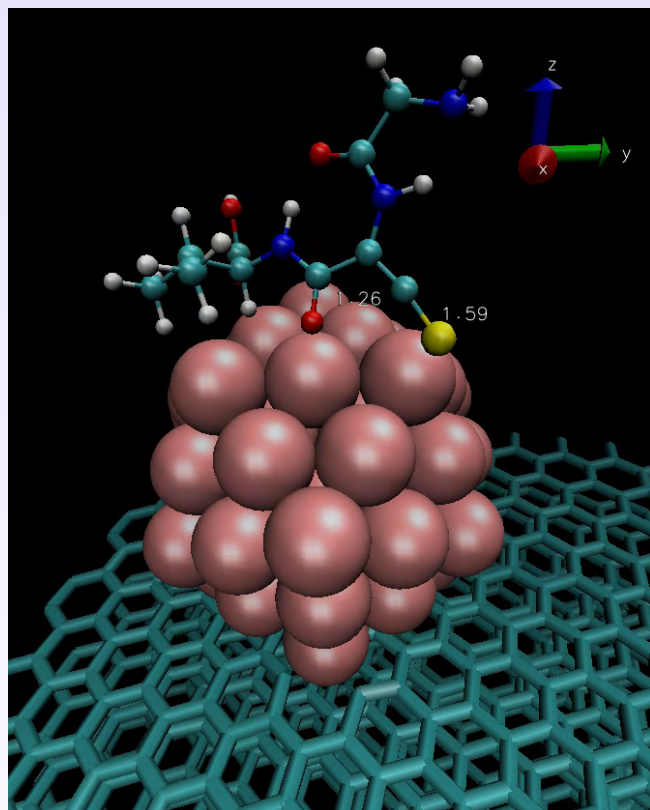
# Protein - Gold interaction through Cys residues (Carlos Sanz)



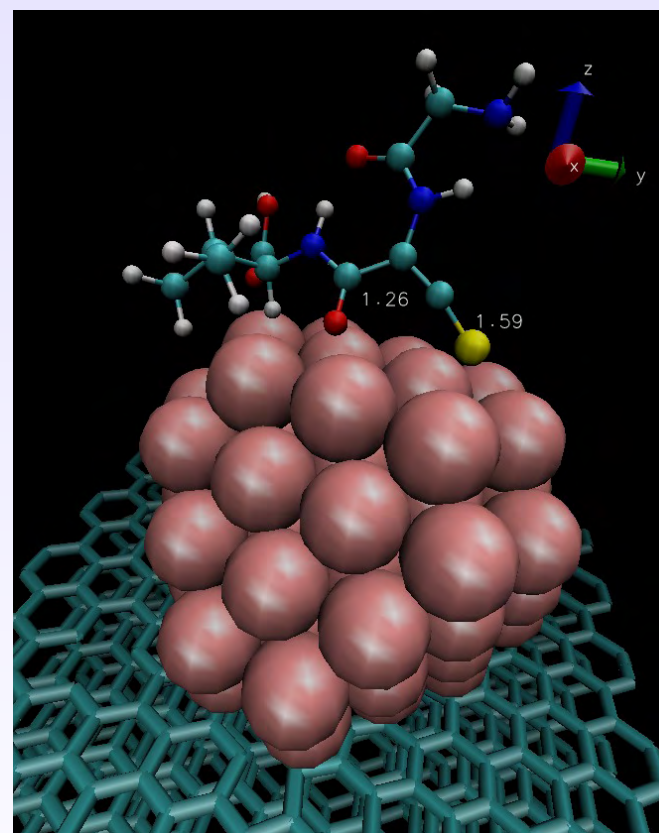


# Protein - Gold interaction through Cys residues (Carlos Sanz)

Au<sub>55</sub>



Au<sub>75</sub>



# CONCLUSIONS

- HPC and atomistic simulations:
  - Large sizes are under our reach, but only for simple methods - Multiscale needed to bridge the size gap.
  - Time scale is still a problem that must be solved (multiscale methods only helps to some extent). New methods (accelerated dynamics, etc) needed.
- A simple 'multi-scale' approach, combining DFT, Tight-Binding and Kubo, allows us to study transport in large samples
- Localization due to chemical functionalization of graphene with Epoxide
  - Metal to insulator crossover upon increasing impurity concentration
  - Strong localization for relatively small amounts of adsorbed Oxygen
- Hybrid QM/MM methods to explore structure and dynamical properties of nanostructures - organic-inorganic interfaces.



## Work done in collaboration with:

- **The SIESTA Team** - Soler, Artacho, García, Sanchez-Portal, Junquera
- M. Brandbyge, J. Taylor, K. Stokbro - T.U. Denmark
- J.L. Mozos, F.D. Novaes - CSIC-Barcelona
- F.D. Novaes, R. Rurali, J.A. Silva - CSIC-Barcelona
- S. Roche - CIN2 (ICN-CSIC) - ICREA Professor
- D. Soriano, J.J. Palacios - Univ. Autónoma Madrid
- N. Leconte, A. Lherbier, J.-C. Charlier - Univ. Cath. Louvain
- C. Sanz - CIN2 (ICN)
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