



Quantum Monte Carlo in the Apuan Alps VII
28th July - 4th August 2012, Vallico Sotto, Tuscany, Italy



Materials Simulations Using Quantum Monte Carlo

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In collaboration with: **Cheng-Rong Hsing (IAMS), Chun-Ming Chang (NDHU)**
Cheng Ching (NCKU), Mei-Yin Chou (IAMS)
Pablo, Neil Drummond, Richard Needs (Cambridge)

Outline

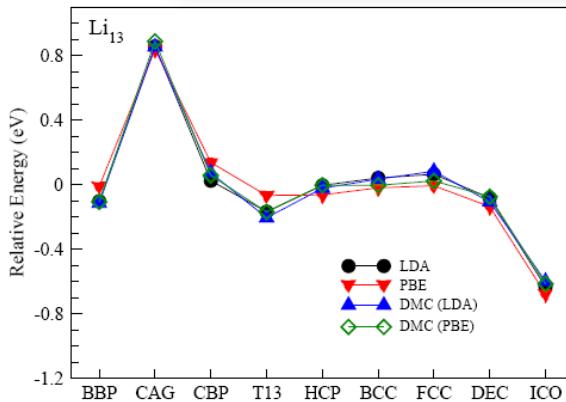
- *Motivation? Why using QMC?*
- *Material Simulations using QMC*
 - ✓ *covalent and metallic clusters*
 - ✓ *band gaps of TiO₂, MgO, NaCl*
 - ✓ *surface adsorption on graphene & Al(100)*
 - ✓ *interlayer binding of two BN sheets*
 - ✓ *surface energy: ΔS(DMC) > ΔS(LDA) > ΔS(PBE)*
 - ✓ *O, OH & H₂O adsorption on surfaces*
 - ✓ *CO adsorption on late TM (111) surfaces*

For Material Simulations:

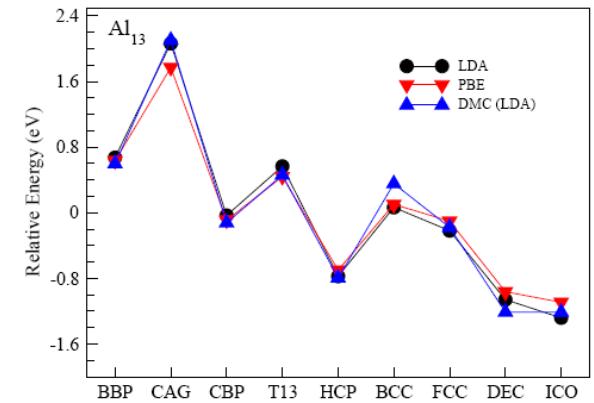
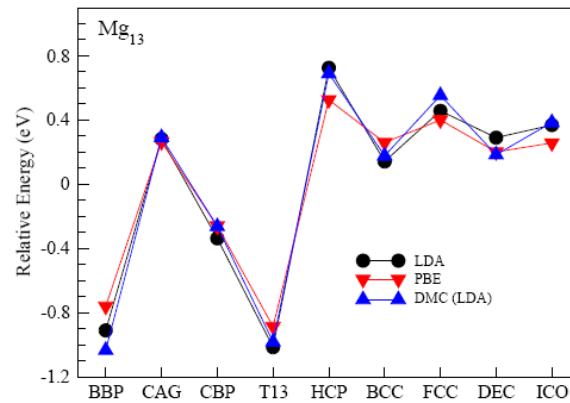
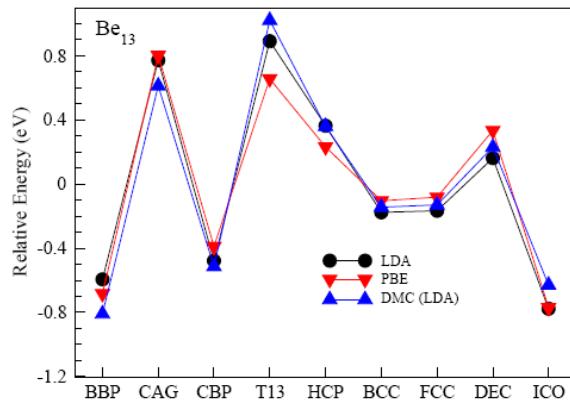
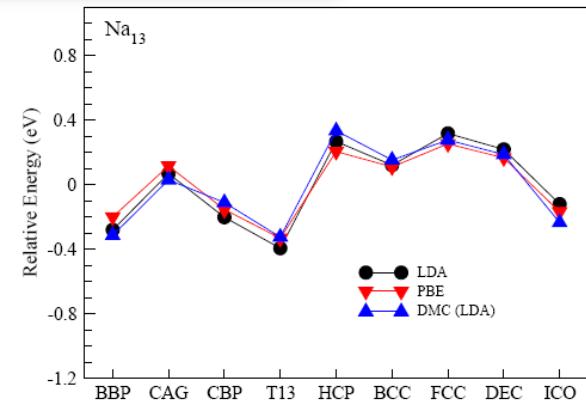
*Density Functional Theory
is a very powerful tool
when the system is*

“well defined”

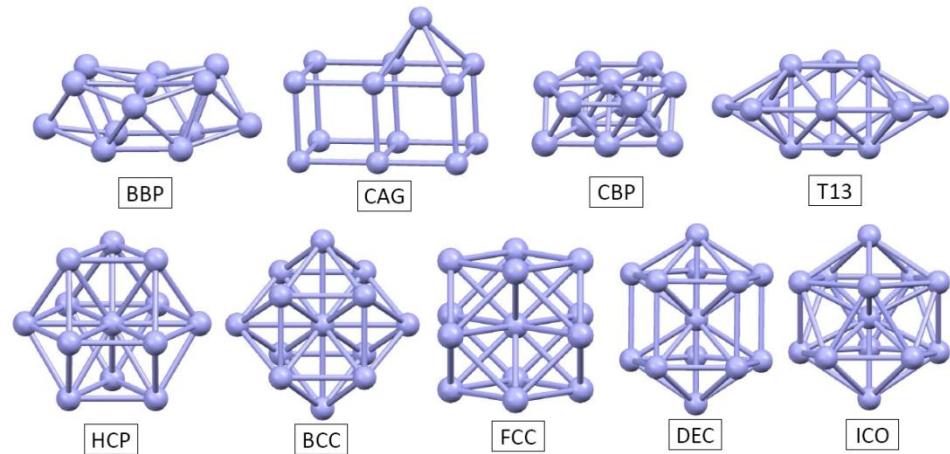
Simple metal Clusters



DFT is reliable in predicting the relative energy of simple metal clusters!



Cluster	(θ)		L	
	LDA	PBE	LDA	PBE
Li_{13}	4.25	12.23	1.02	1.02
Na_{13}	15.23	15.59	1.01	0.83
Be_{13}	11.57	16.77	0.97	1.09
Mg_{13}	6.76	7.87	0.98	0.81
Al_{13}	7.27	6.00	0.98	0.81



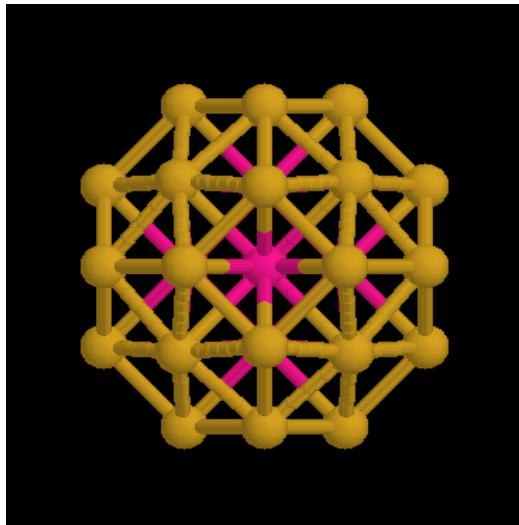
$$\cos \theta = \frac{\vec{\mathcal{D}}^{\text{DFT}} \cdot \vec{\mathcal{D}}^{\text{DMC}}}{|\vec{\mathcal{D}}^{\text{DFT}}| |\vec{\mathcal{D}}^{\text{DMC}}|}$$

$$L = \frac{|\vec{\mathcal{D}}^{\text{DFT}}|}{|\vec{\mathcal{D}}^{\text{DMC}}|}$$

*The **CORRECT** choice of
Exchange-Correlation
Approximation
is a “**BIG**” issue
*in DFT !**

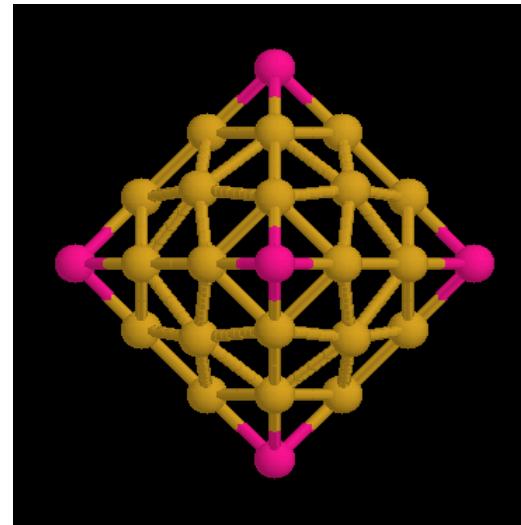
DFT is very great, why bother using Quantum Monte Carlo ?

Which Au_{38} is a more stable structure ?



$$E_{fcc} = -131.98 \text{ eV}$$

(LDA)



$$E_{O_h} = -130.81 \text{ eV}$$

$$E_{fcc} = -100.40 \text{ eV}$$

(PBE)

$$E_{O_h} = -101.86 \text{ eV}$$

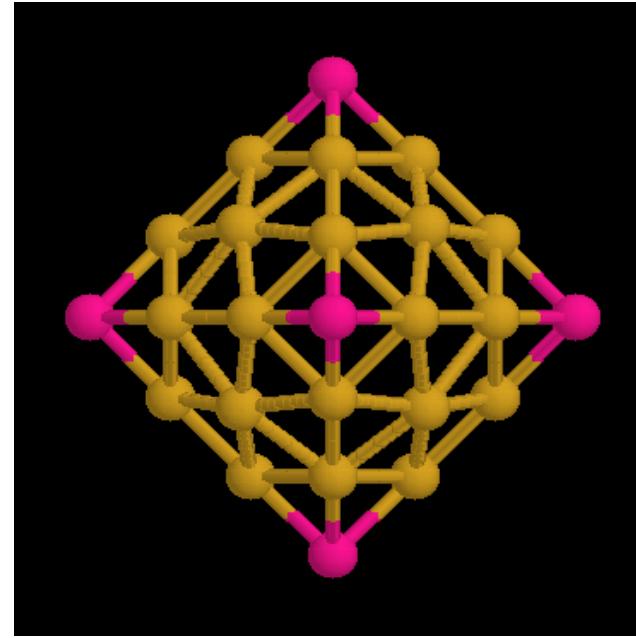
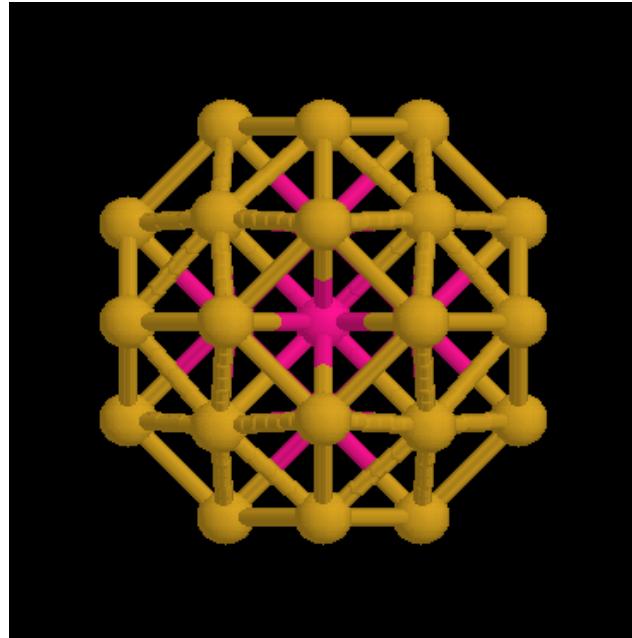
$$E_{fcc} = -97.50 \text{ eV}$$

(PW91)

$$E_{O_h} = -99.02 \text{ eV}$$

$\Delta E_{rel} > 2.5 \text{ eV} \dots$ need more accurate methods? QMC

Which Au_{38} is a more stable structure?



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(LDA)

$$E_{O_h} = -130.81 \text{ eV}$$

$$E_{fcc} = -100.40 \text{ eV}$$

(PBE)

$$E_{O_h} = -101.86 \text{ eV}$$

$$E_{fcc} = -97.50 \text{ eV}$$

(PW91)

$$E_{O_h} = -99.02 \text{ eV}$$

$$E_{fcc} = -33541.66 \text{ eV}$$

(QMC)

$$E_{O_h} = -33541.58 \text{ eV}$$

**Here statistical error of DMC energy is ~ 0.2 eV,
so the two structures are almost degenerate...!**

First-principles study of metal adatom adsorption on graphene

Kevin T. Chan,^{1,2} J. B. Neaton,³ and Marvin L. Cohen^{1,2}

¹*Department of Physics, University of California, Berkeley, California 94720, USA*

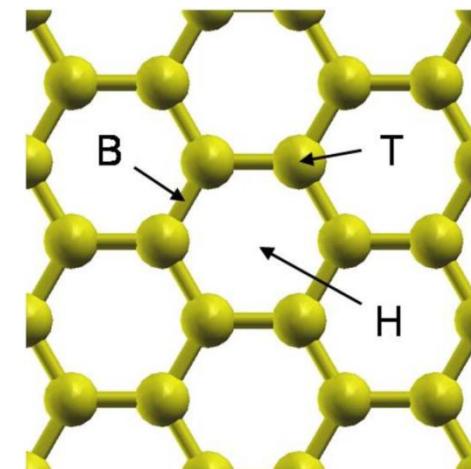
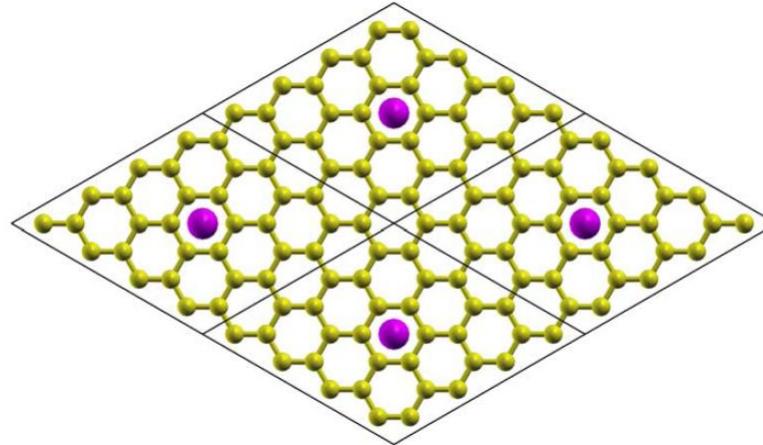
²*Materials Sciences Division, Lawrence Berkeley National Laboratory, Berkeley, California 94720, USA*

³*The Molecular Foundry, Lawrence Berkeley National Laboratory, Berkeley, California 94720, USA*

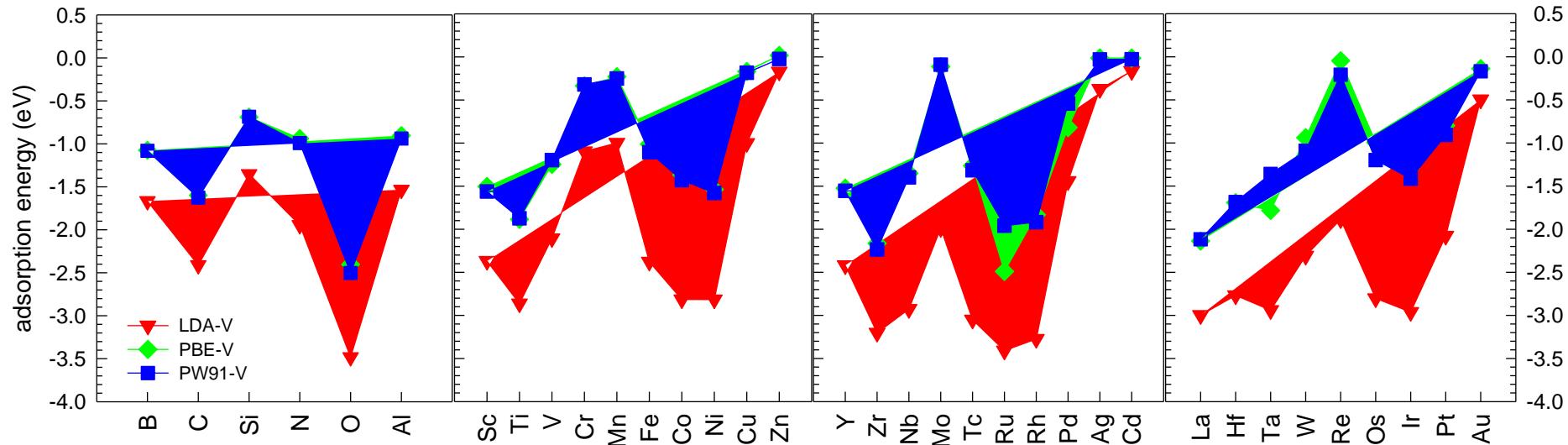
(Received 30 April 2008; published 20 June 2008)

VASP-PBE

Li, Na, K, Ca, Al, Ga, In, Sn, Ti, Fe, Pd, Au



Single atom @ graphene

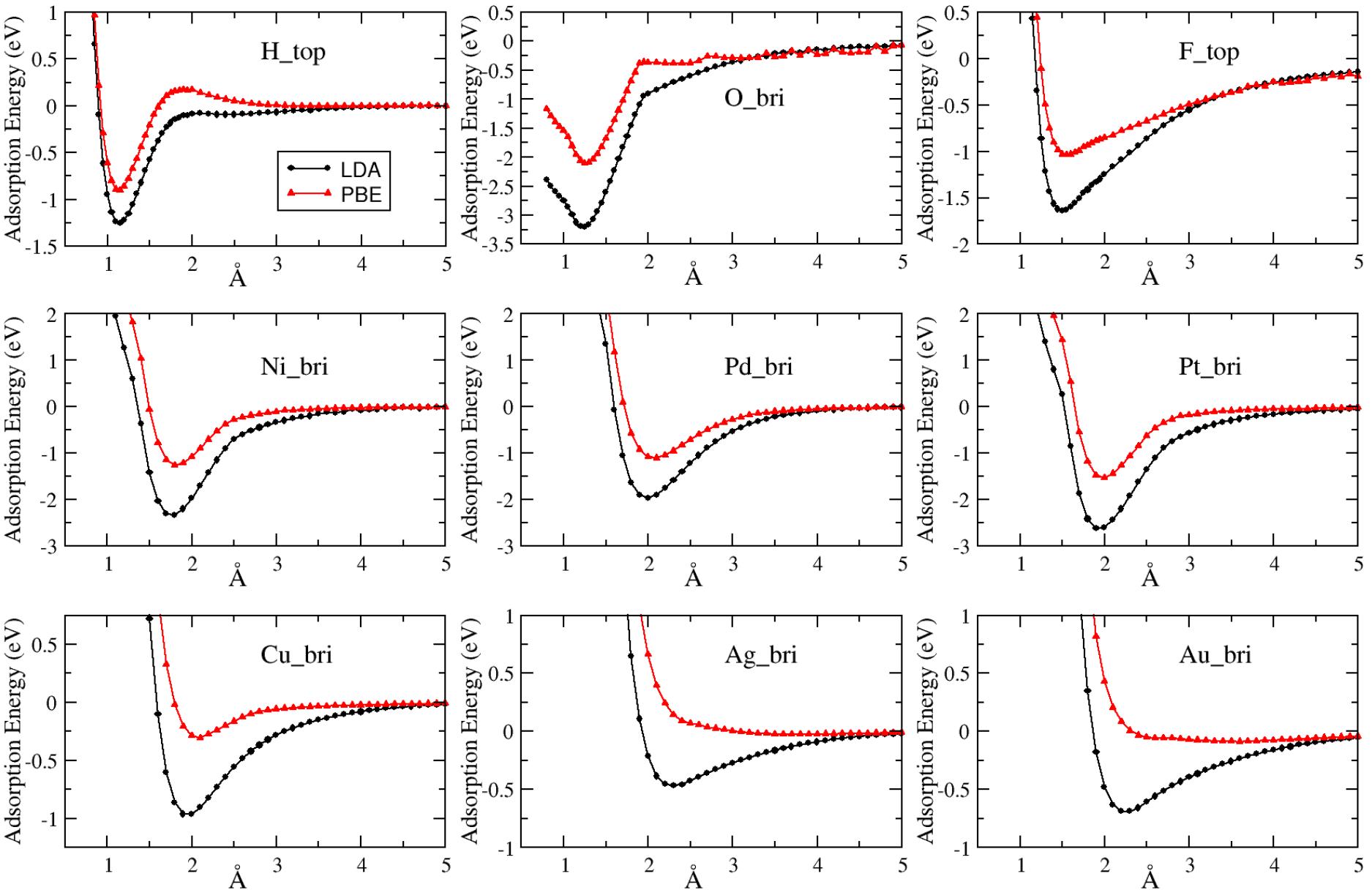


**LDA & GGA predict different adsorption energy
at preferred adsorption site!**

Except for Zn & Cd atom, the adsorption energy difference obtained by LDA and GGA is ranging from 0.4 ~ 1.8 eV.

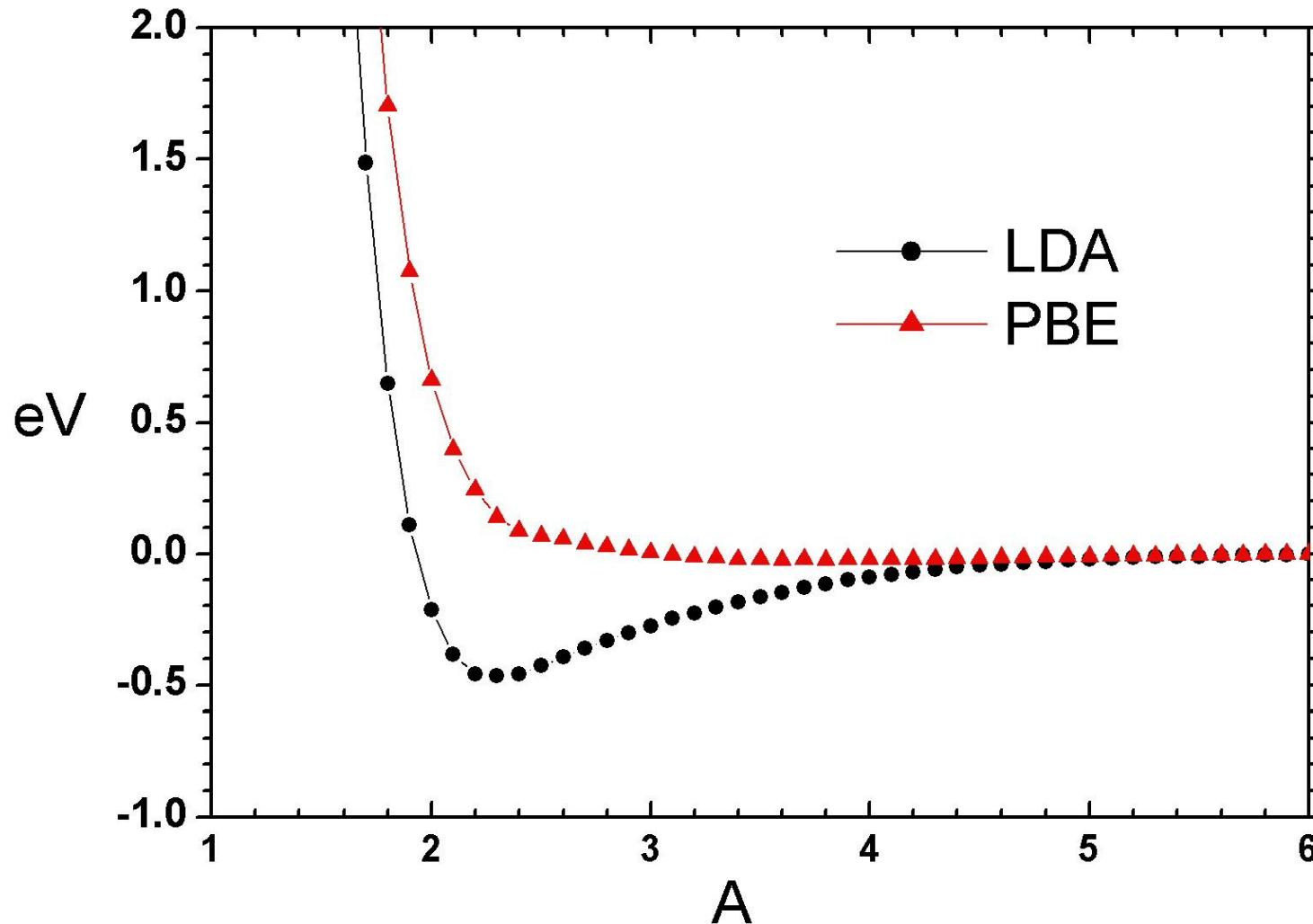
**QMC is needed to check the accuracy of
exchange-correlation approximations !**

Single atom@graphene (DFT results)



Need more accurate methods? QMC

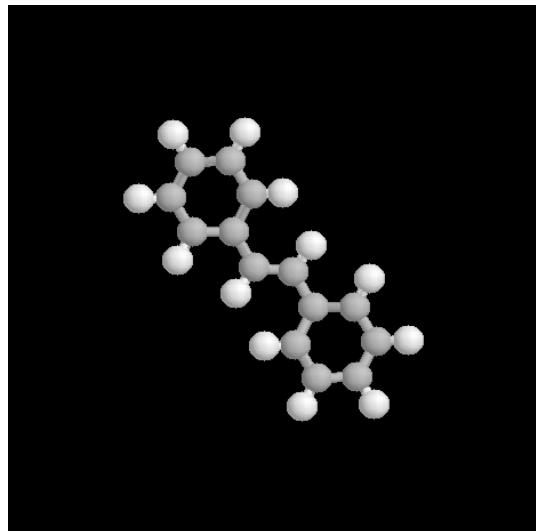
Adsorption energy of Ag on graphene



DFT give wrong adsorption energy & geometry?

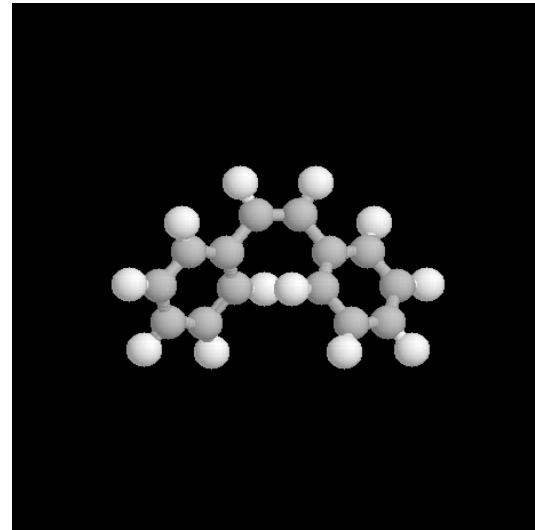
Need more accurate methods? QMC

trans-stilbene

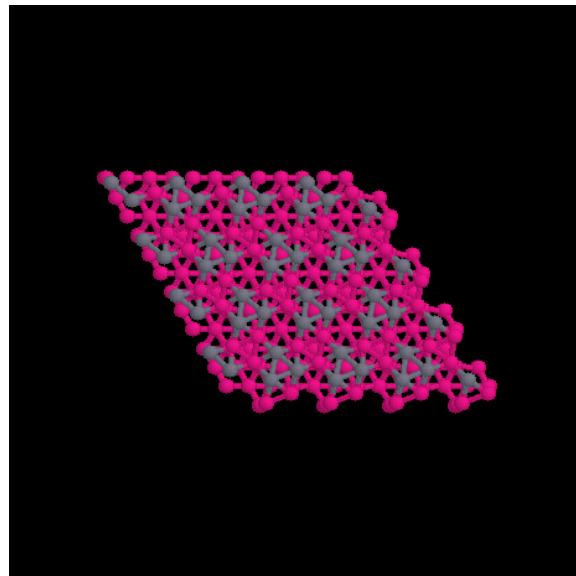


$$E_{\text{trans}} = 0.0 \text{ eV}$$

cis-stilbene

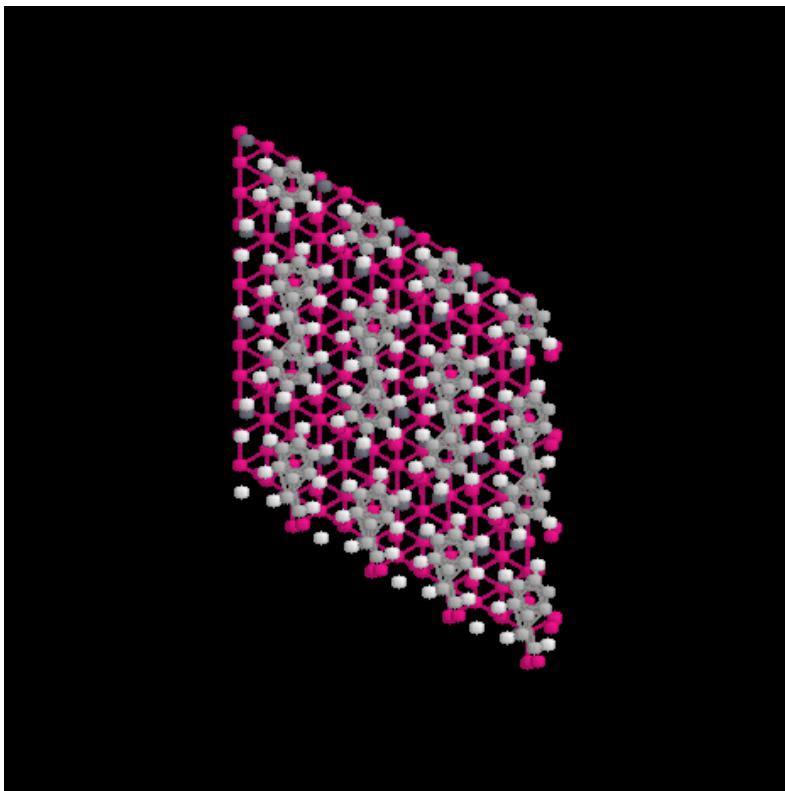


$$E_{\text{cis}} = 0.204 \text{ eV}$$



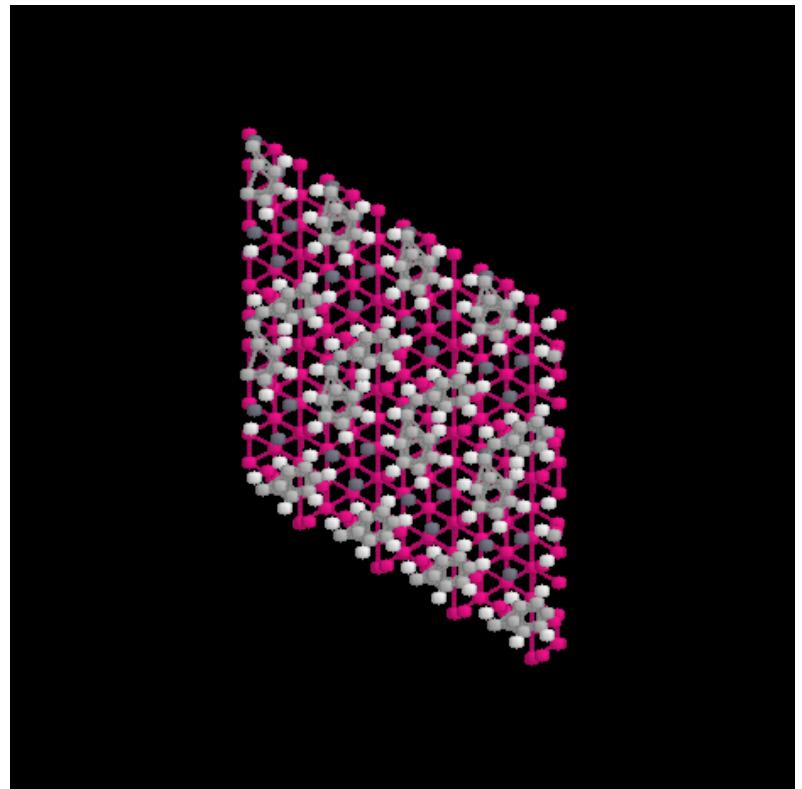
Ag-Ge(111)-IET

trans-stilbene/Ag-Ge(111)



$E_{ads} = 1.059 \text{ eV (LDA)}$

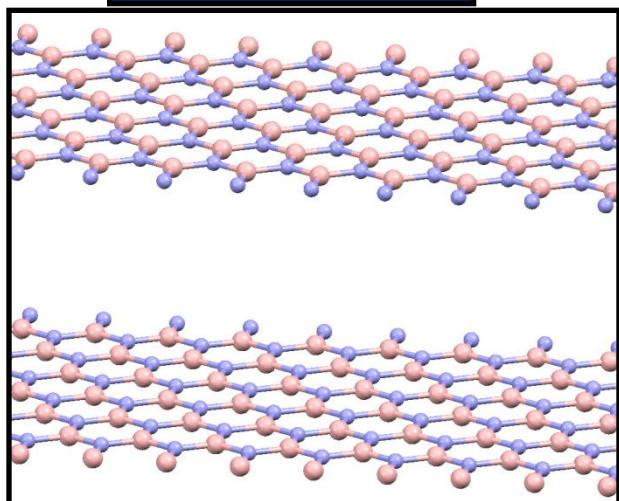
cis-stilbene/Ag-Ge(111)



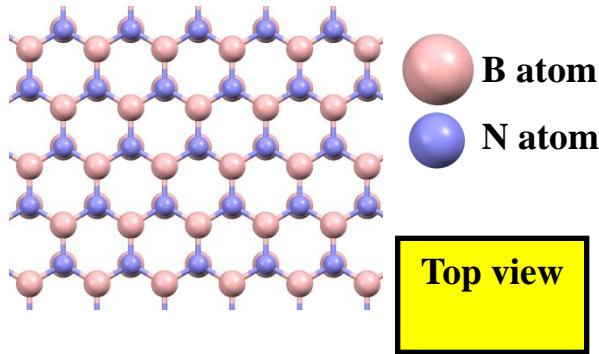
$E_{ads} = 0.887 \text{ eV (LDA)}$

LDA agrees expt., but... $E_{ads} \sim 0.40 \text{ & } 0.20 \text{ eV (PW91)}$ and thus DFT has little (or no) predicting power!!!

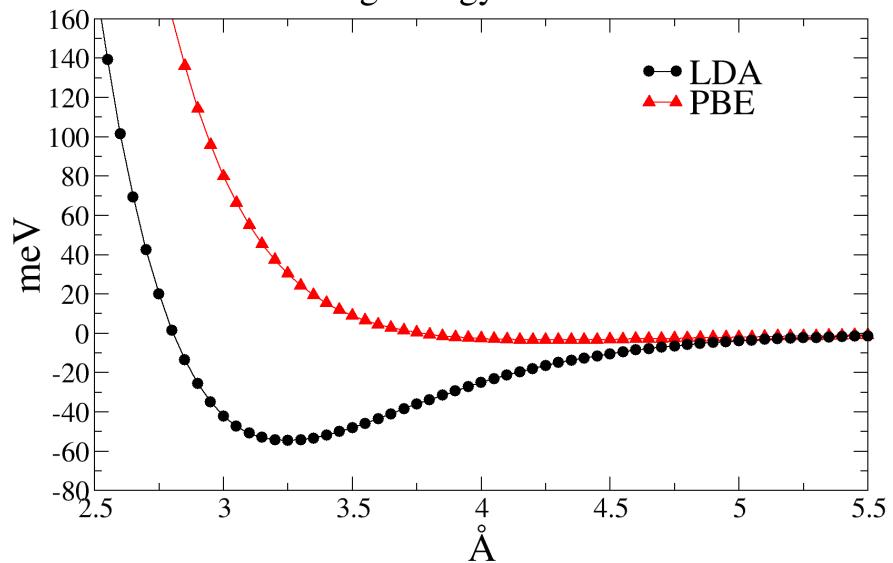
Boron nitride sheet



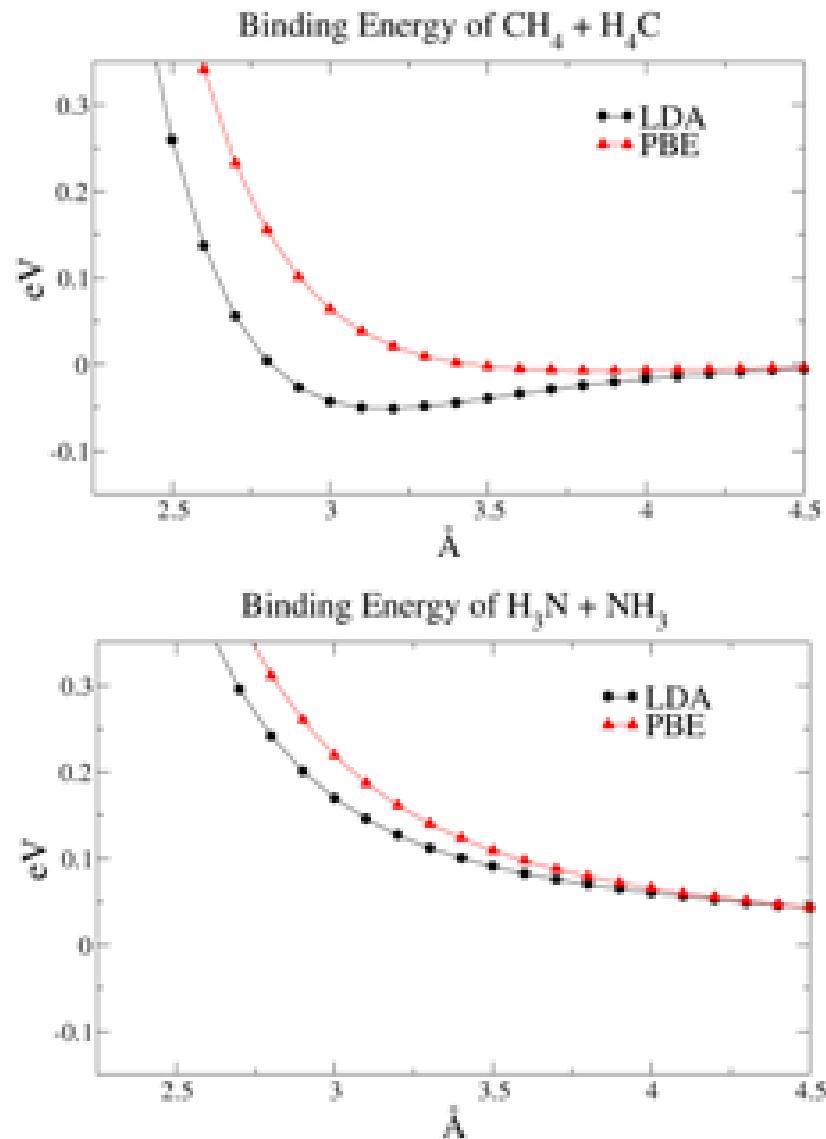
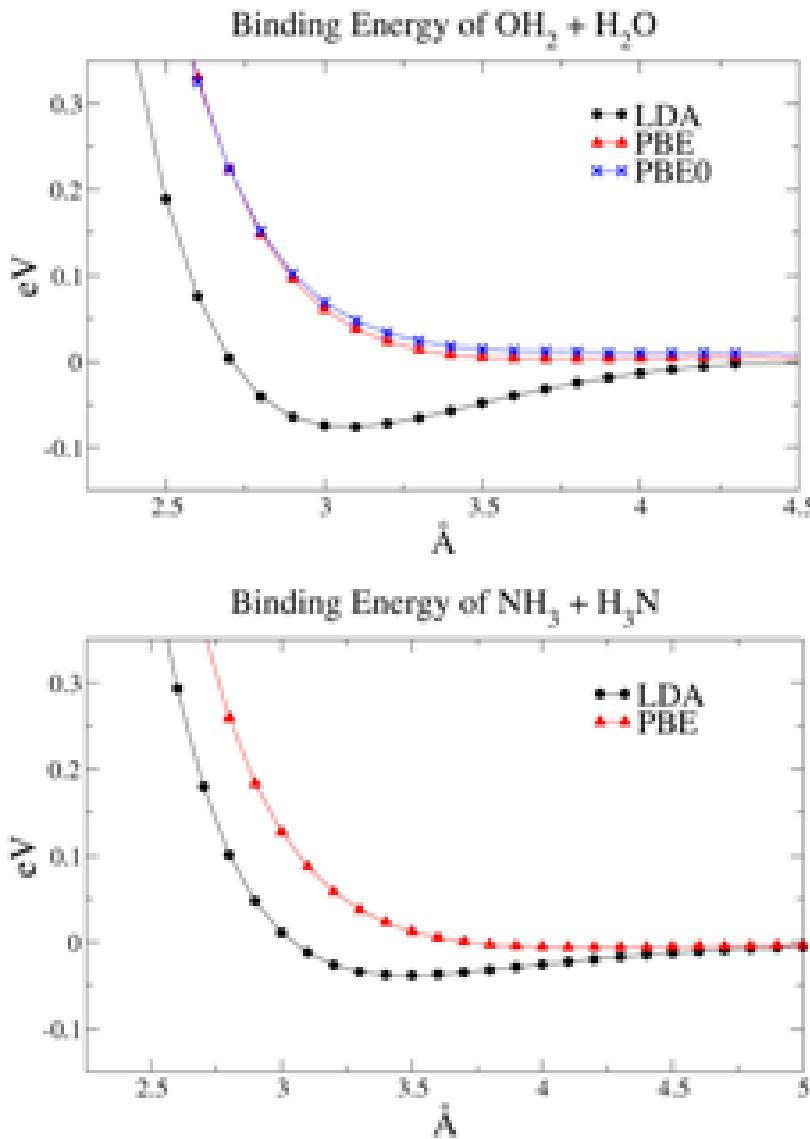
Side view



Binding Energy of BN Sheets



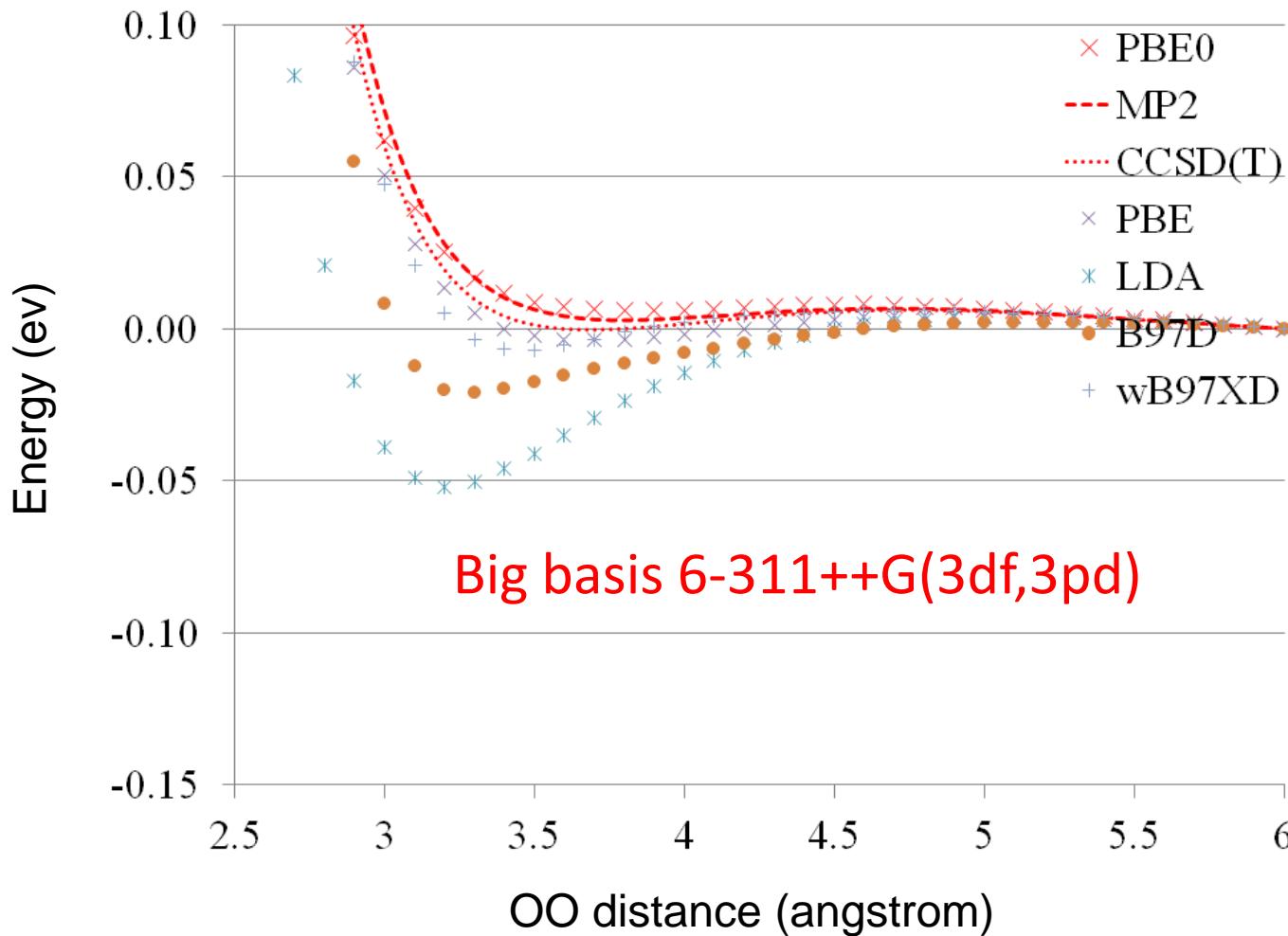
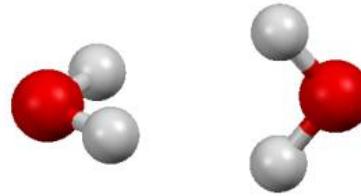
*LDA is more correct
than GGA by
judging from QMC!*



GGA is perhaps more correct than LDA!

Water dimer interaction (results from Dr. Kaito)

GGA (PBE) is more match
with CCSD(T) than LDA



Applications of *Ab Initio* Random Structure Searching

Richard Needs

University of Cambridge, UK

Chris Pickard

University College London, UK

QMC in the Apuan Alps 2009, Vallico Sotto, Italy, 25 July – 1st August
2009

Ab Initio Random Structure Searching

- Make a random unit cell
- Throw the required numbers of each atom type into the cell at random
- Relax under the quantum mechanical forces and stresses
- Repeat until happy or computing credits run out
- Look at lowest-energy or other interesting structures

Pickard and Needs, Phys Rev Lett 97, 045504 (2006)



We have tried very hard to train ourselves to become a sniffer dog in global structure search

"As it's your first day we're going to start you on something easy"

Group	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
Period																		
1	1 H 1.008																	2 He 4.0026
2	3 Li 6.94	4 Be 9.0122																10 Ne 20.180
3	11 Na 22.990	12 Mg 24.305																18 Ar 39.948
4	19 K 39.098	20 Ca 40.078	21 Sc 44.956	22 Ti 47.867	23 V 50.942	24 Cr 51.996	25 Mn 54.938	26 Fe 55.845	27 Co 58.933	28 Ni 58.693	29 Cu 63.546	30 Zn 65.38	31 Ga 69.723	32 Ge 72.63	33 As 74.922	34 Se 78.96	35 Br 79.904	36 Kr 83.798
5	37 Rb 85.468	38 Sr 87.62	39 Y 88.906	40 Zr 91.224	41 Nb 92.906	42 Mo 95.96	43 Tc [97.91]	44 Ru 101.07	45 Rh 102.91	46 Pd 106.42	47 Ag 107.87	48 Cd 112.41	49 In 114.82	50 Sn 118.71	51 Sb 121.76	52 Te 127.60	53 I 126.90	54 Xe 131.29
6	55 Cs 132.91	56 Ba 137.33	* 71 Lu 174.97	72 Hf 178.49	73 Ta 180.95	74 W 183.84	75 Re 186.21	76 Os 190.23	77 Ir 192.22	78 Pt 195.08	79 Au 196.97	80 Hg 200.59	81 Tl 204.38	82 Pb 207.2	83 Bi 208.98	84 Po [208.98]	85 At [209.99]	86 Rn [222.02]
7	87 Fr [223.02]	88 Ra [226.03]	** 103 Lr [262.11]	104 Rf [265.12]	105 Db [268.13]	106 Sg [271.13]	107 Bh [270]	108 Hs [277.15]	109 Mt [276.15]	110 Ds [281.16]	111 Rg [280.16]	112 Cn [285.17]	113 Uut [284.18]	114 Fl [289.19]	115 Uup [288.19]	116 Lv [293]	117 Uus [294]	118 Uuo [294]

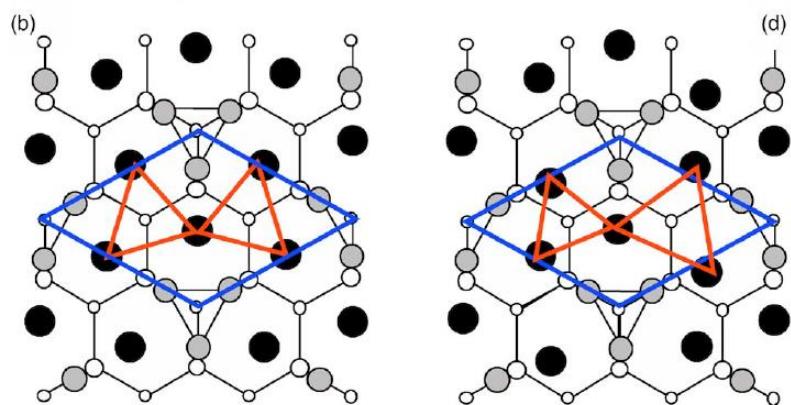
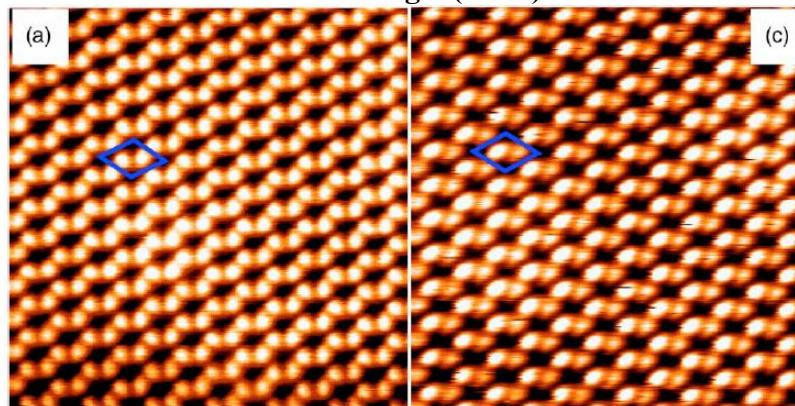
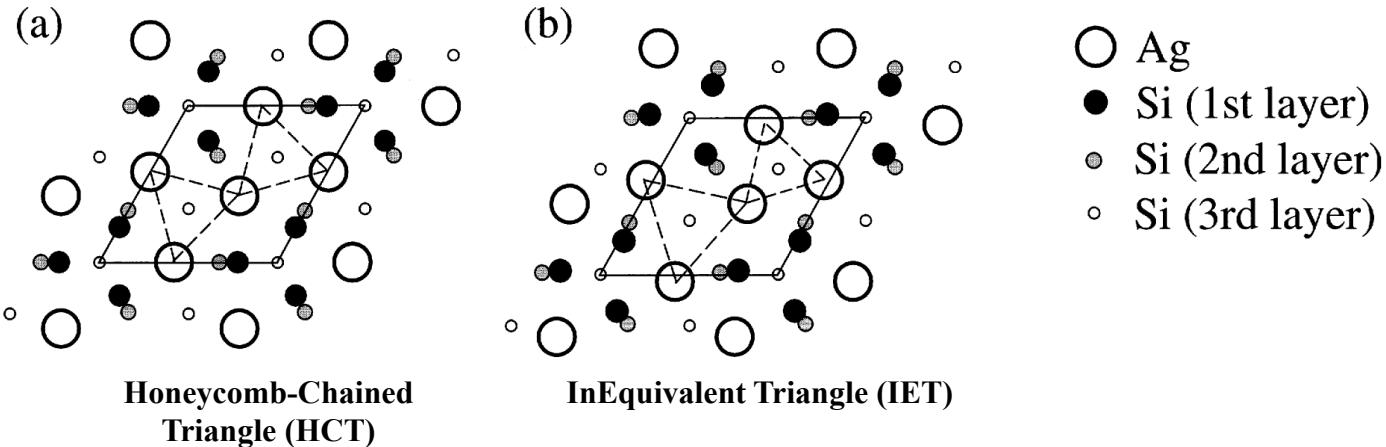
*Study of adsorbate-induced
 $\sqrt{3} \times \sqrt{3}$ reconstruction on Si(111)*

Silicon
Diamond:
5.430 Å
3s²3p²

Silver
FCC : 4.09 Å
5s¹4d¹⁰

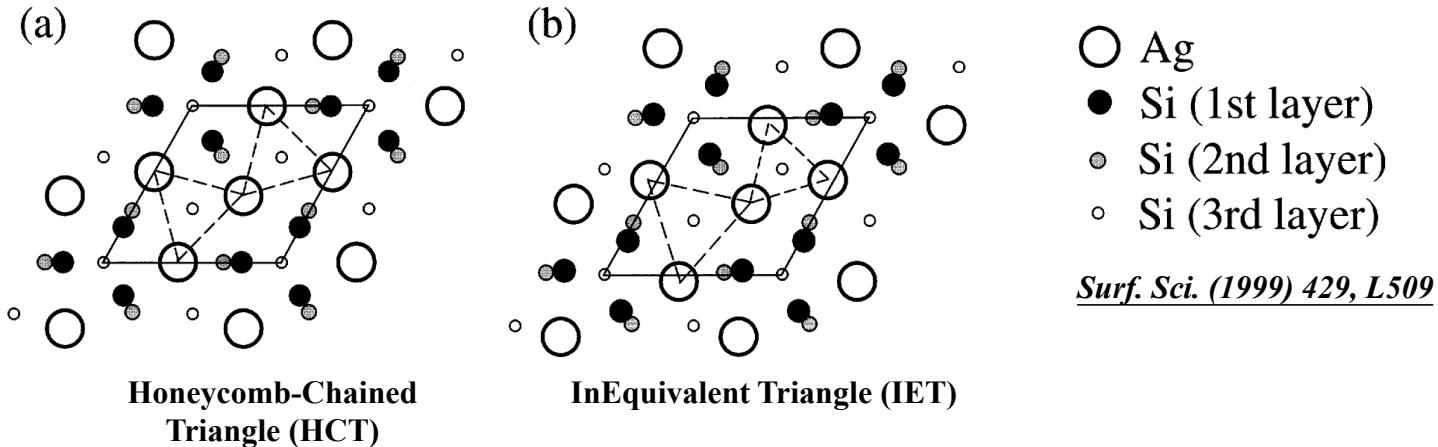
Gold
FCC : 4.08 Å
6s¹4f¹⁴5d¹⁰

1ML Ag/Si(111)- $\sqrt{3}\times\sqrt{3}$ (IET)

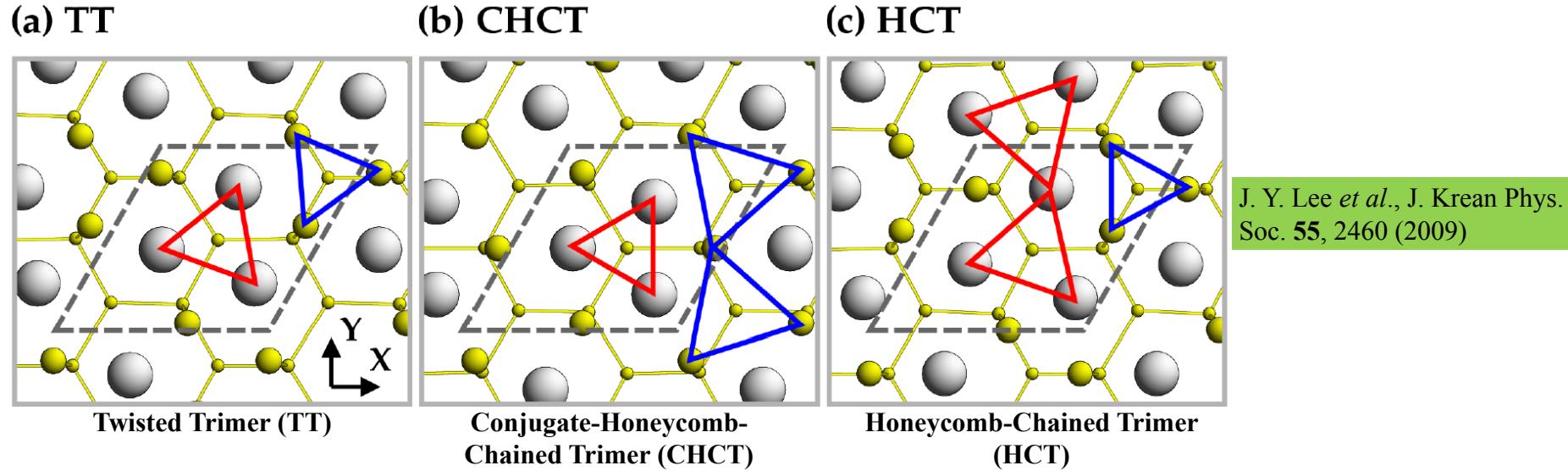


- a) STM image at RT, Vs=-0.6 V and I=1.0 nA, 84x84 Å.
- b) HCT model.
- c) STM image obtained at the same area as image (a), Vs=-0.3 V and I=0.3 nA, 84x84 Å.
- d) IET model.

1ML Ag/Si(111)- $\sqrt{3}\times\sqrt{3}$ (IET)



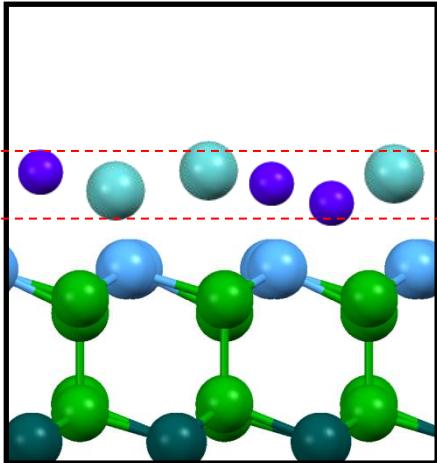
1ML Au/Si(111)- $\sqrt{3}\times\sqrt{3}$ (CHCT)



AIRSS calculation

Constraints

- The distance between any two adatom is more than 2.1Å
- Z-axis range : 1.5~3.0Å above surface Si atom



Adsorbate atom



Si - surface



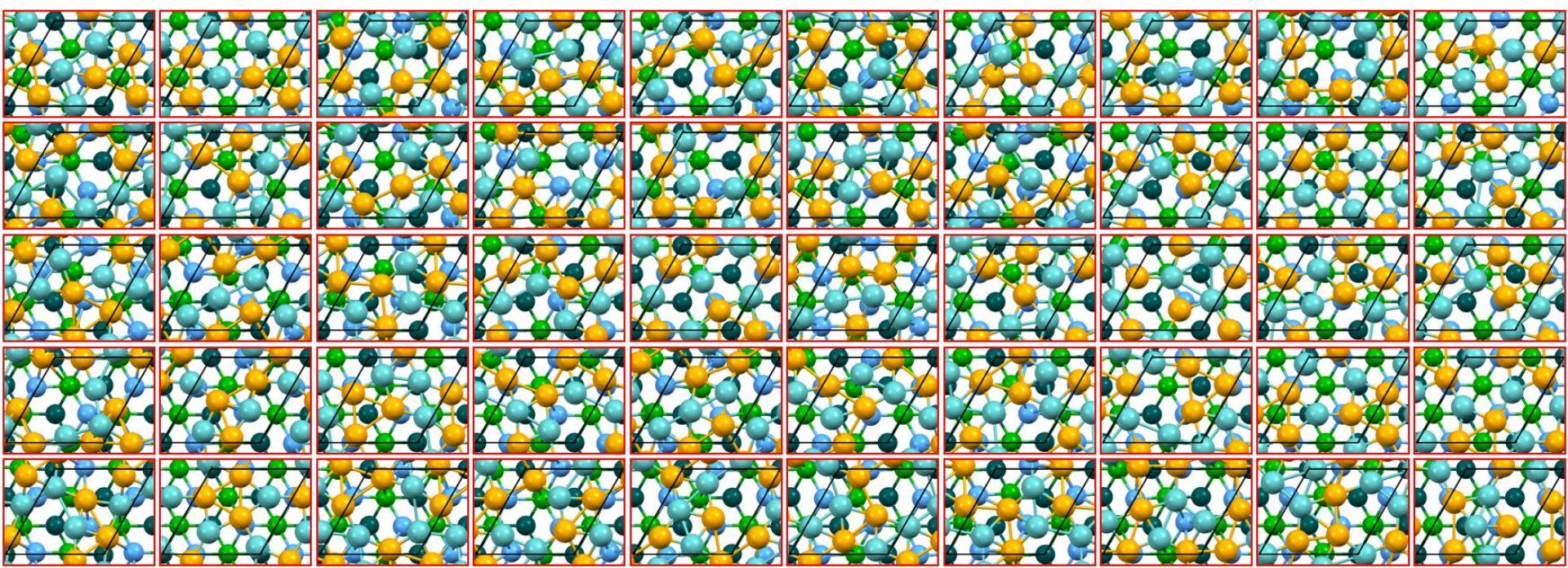
Si - 1st layer (T1 site)



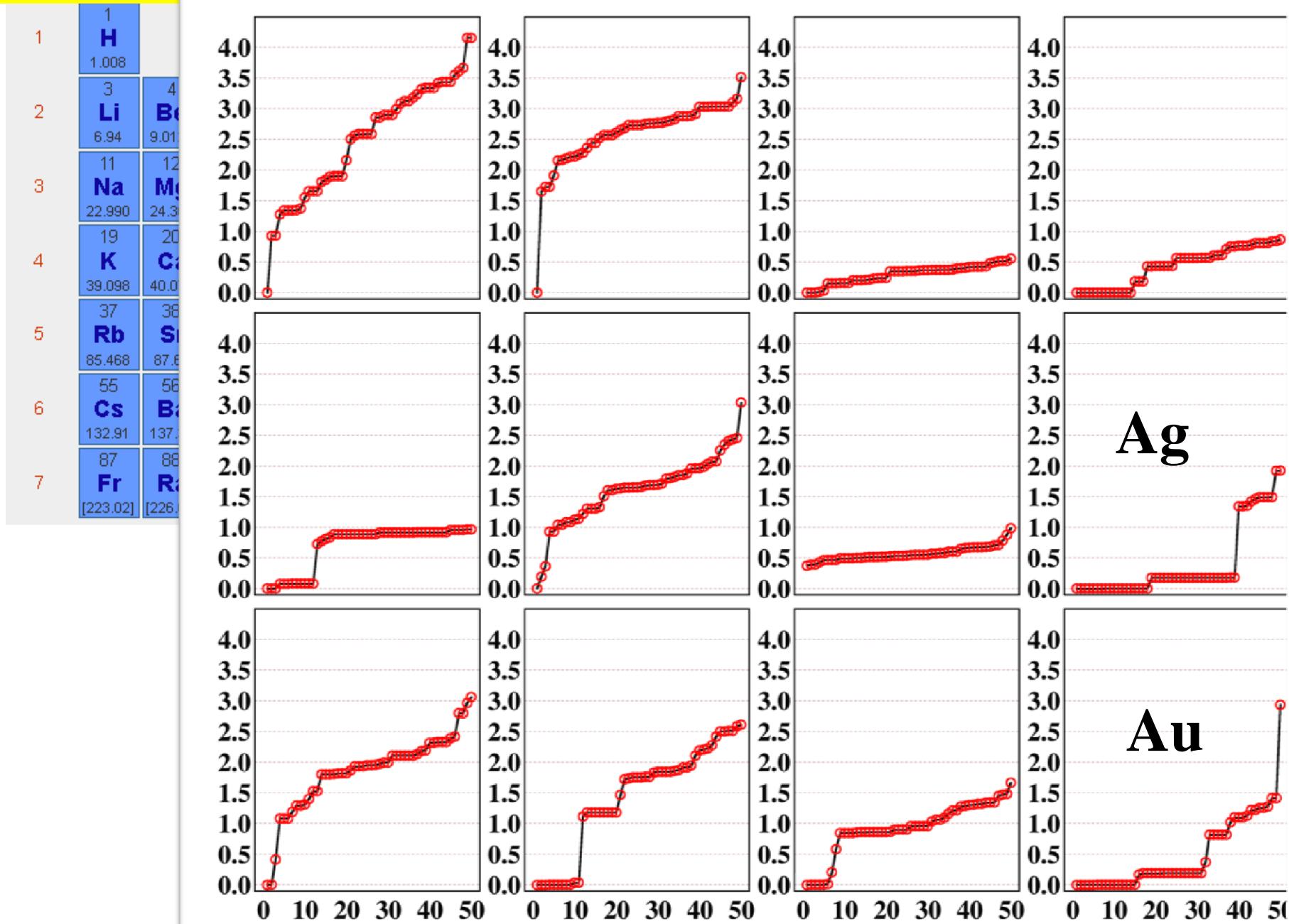
Si - 2nd & 3rd layer (T4 site)



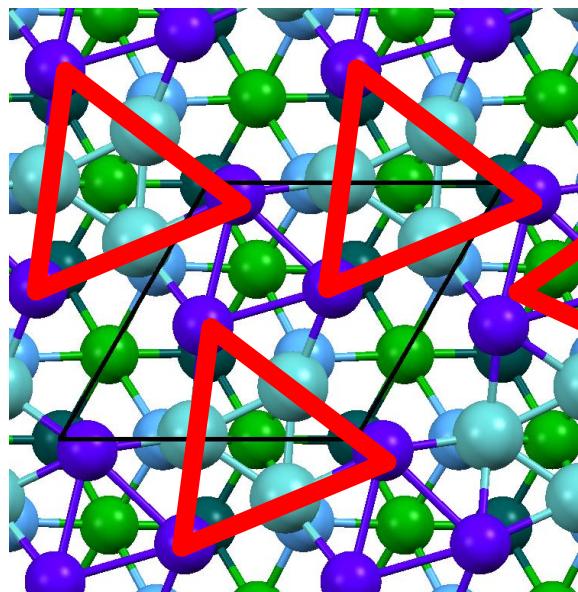
Si - 4th layer (H3 site)



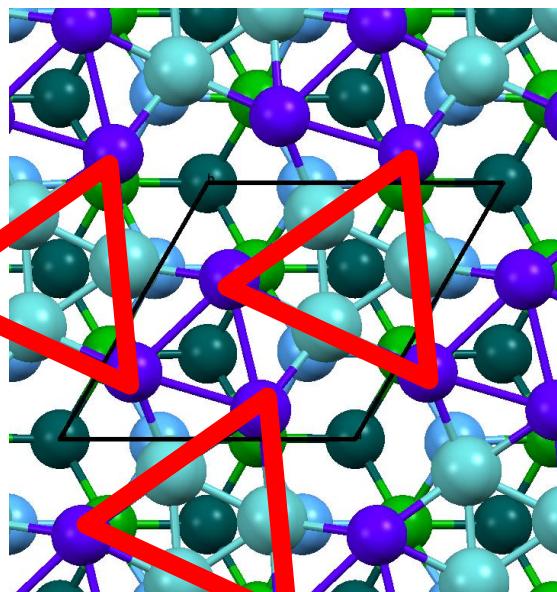
preliminary studies (AIRSS results)



AIRSS results

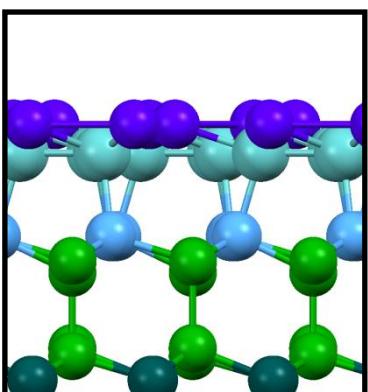
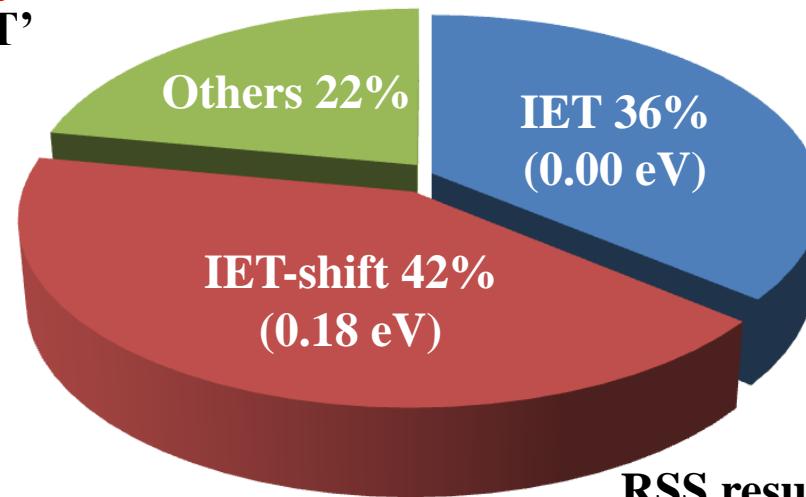
[Kr]5s¹ 4d¹⁰

IET



IET'

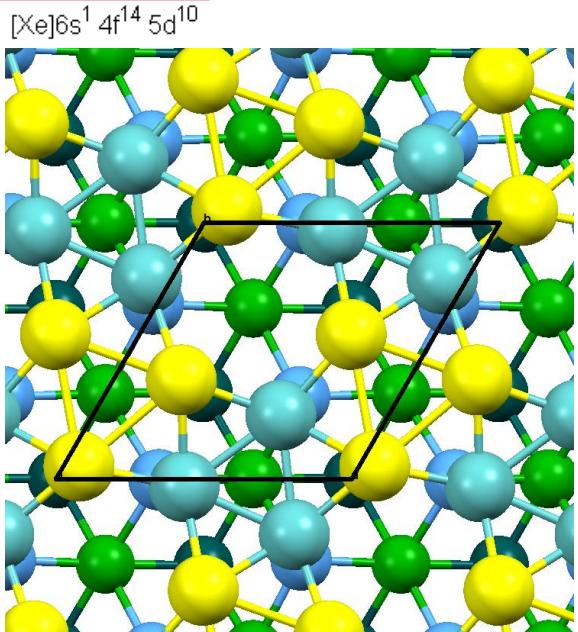
	PBE	LDA
IET	0.000	0.000
HCT	0.037	0.138
CHCT	1.164	0.764



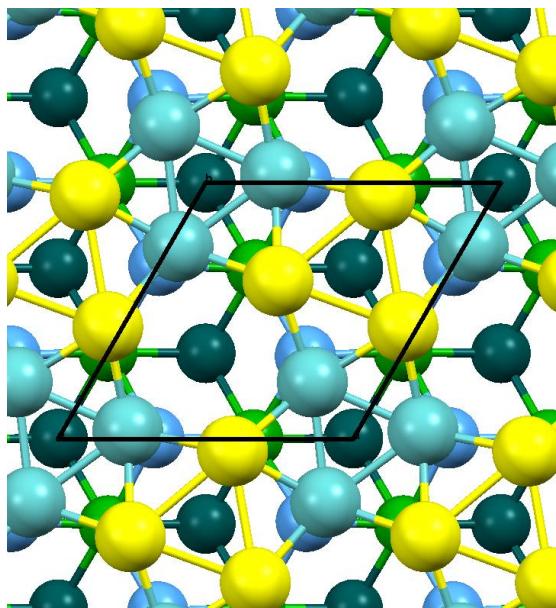
- Ag atom
- Si - surface
- Si - 1st layer (T1 site)
- Si - 2nd & 3rd layer (T4 site)
- Si - 4th layer (H3 site)

79	2
金	8
Gold	18
	32
	18
	1
196.966569	

AIRSS results

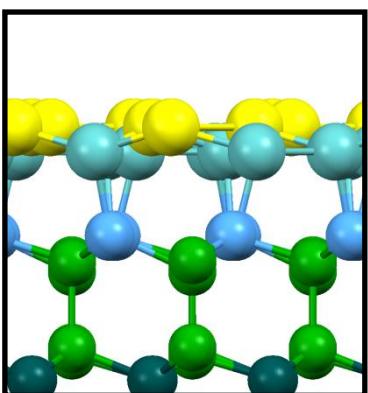


IET

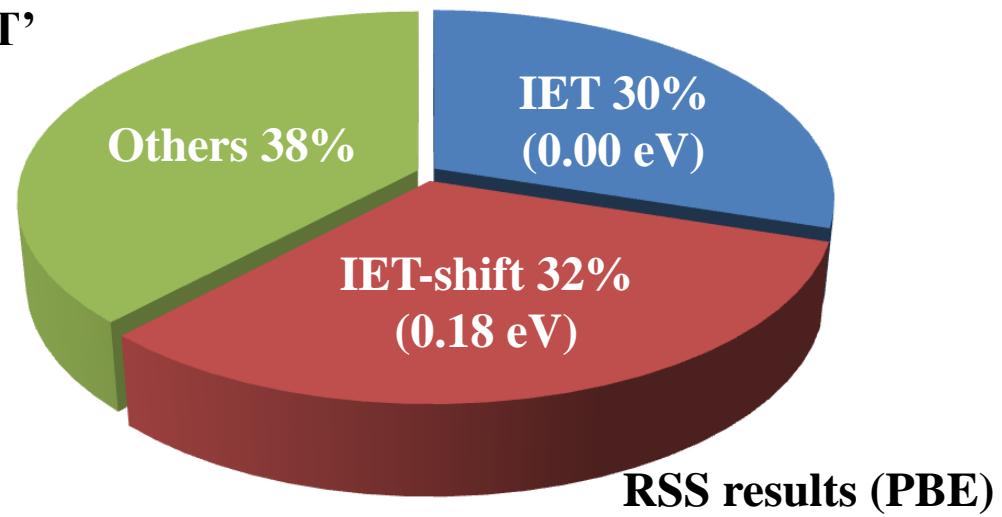


IET'

	PBE	LDA
IET	0.000	
HCT	0.081	
CHCT	0.084	



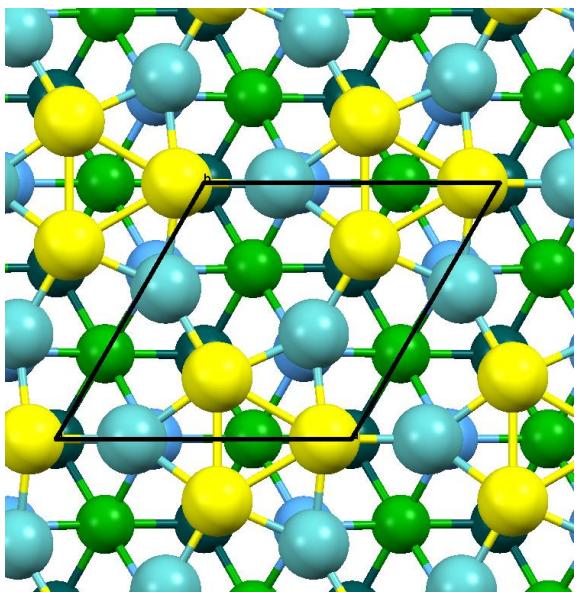
- Au atom
- Si - surface
- Si - 1st layer (T1 site)
- Si - 2nd & 3rd layer (T4 site)
- Si - 4th layer (H3 site)



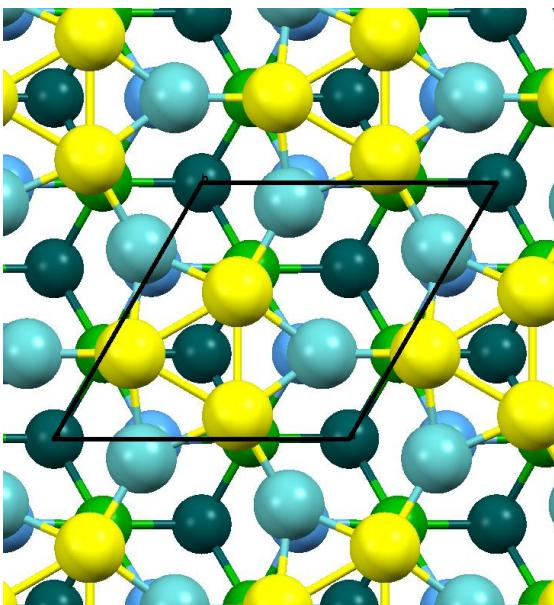
79	2
金	8
Gold	18
	32
	18
	1
196.966569	

AIRSS results (*PES is unknown from DFT ?*)

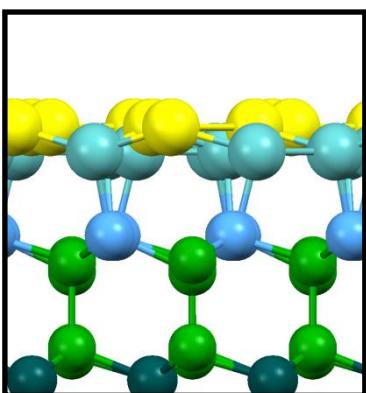
[Xe]6s¹ 4f¹⁴ 5d¹⁰



CHCT

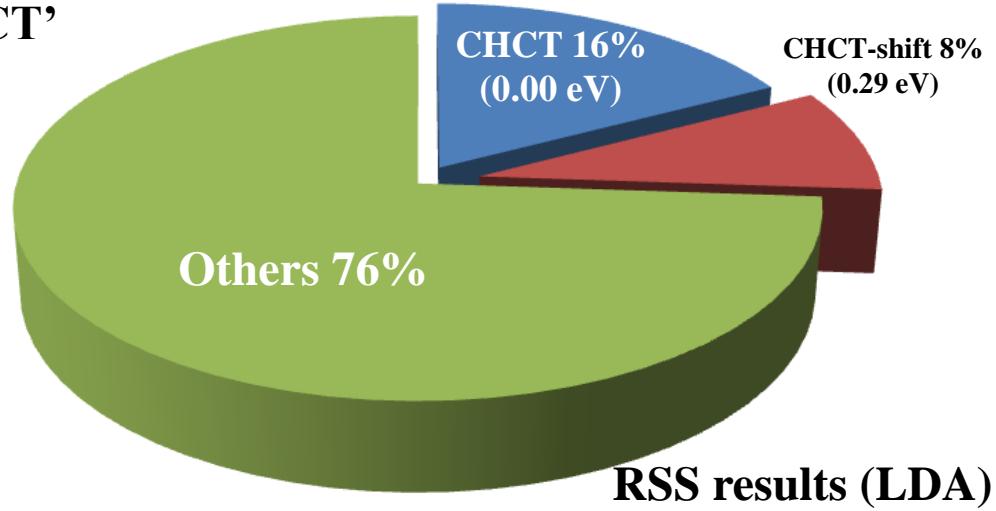


CHCT'



- Au atom
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- Si - 2nd & 3rd layer (T4 site)
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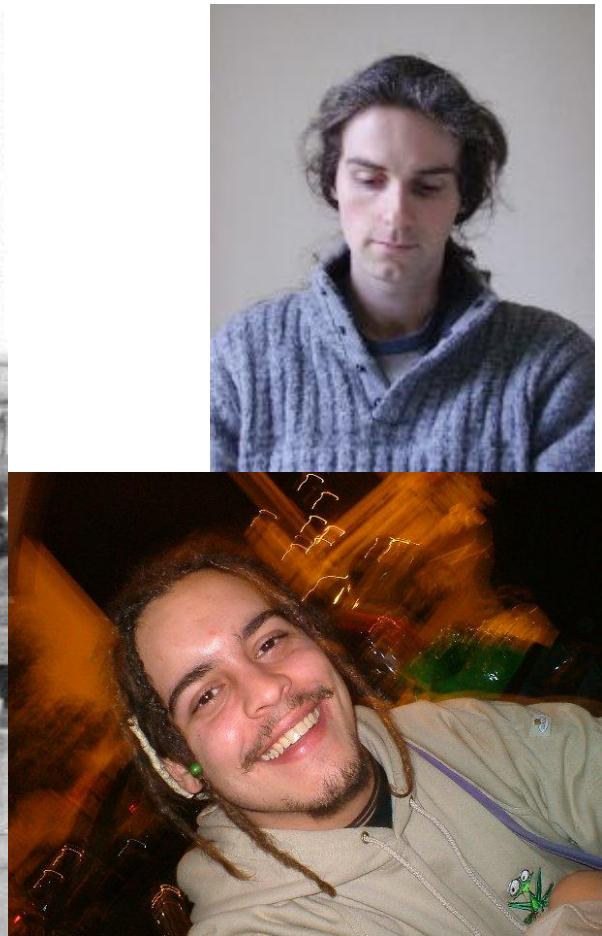
	PBE	LDA
IET	0.000	→ CHCT
HCT	0.081	0.453
CHCT	0.084	0.000



CASINO code : QMC Methods

<http://www.tcm.phy.cam.ac.uk/~mdt26/casino2.html>

R.J. Needs, M.D. Towler, N.D. Drummond and P. López Ríos, CASINO version 2.3 User Manual, University of Cambridge, Cambridge (2008).

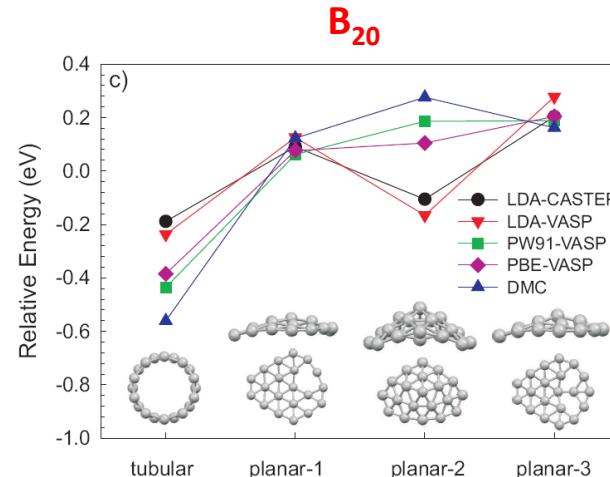
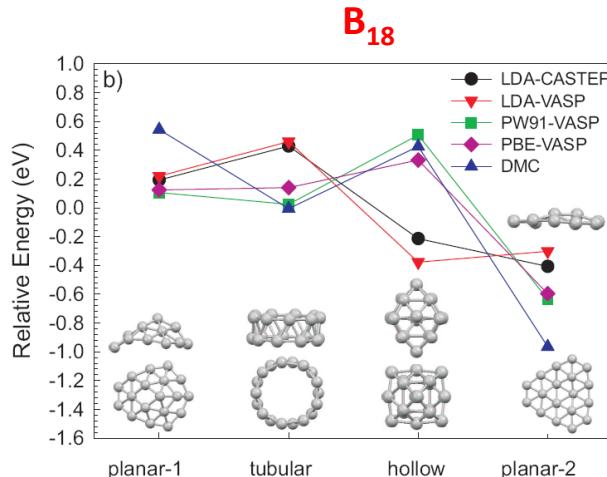
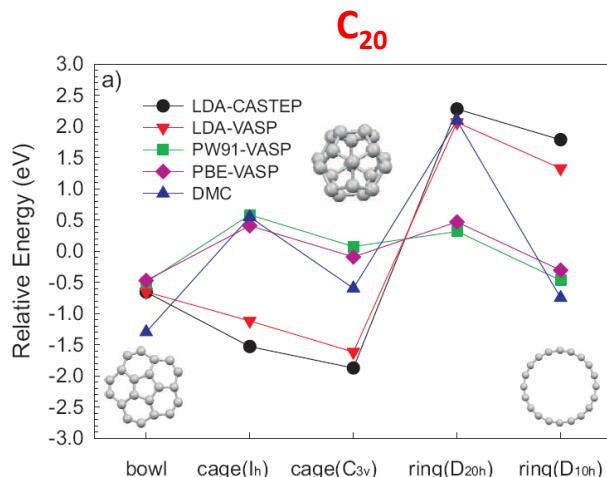


Outline

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- *Material Simulations using QMC*
 - ✓ **covalent and metallic clusters**
 - ✓ *band gaps of TiO_2 , MgO , $NaCl$*
 - ✓ *surface adsorption on graphene & Al(100)*
 - ✓ *interlayer binding of two BN sheets*
 - ✓ *surface energy: $\Delta S(DMC) > \Delta S(LDA) > \Delta S(PBE)$*
 - ✓ *O, OH & H_2O adsorption on surfaces*
 - ✓ *CO adsorption on late TM (111) surfaces*

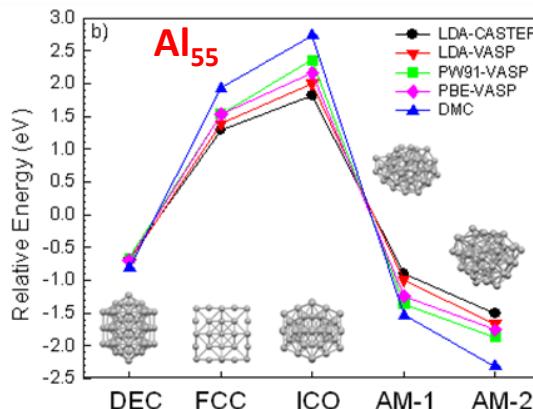
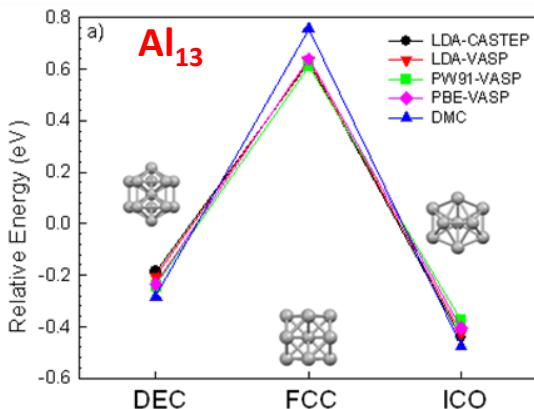
C_{20} , B_{18} , B_{20} , Al_{13} and Al_{55} Clusters

I. Covalent clusters



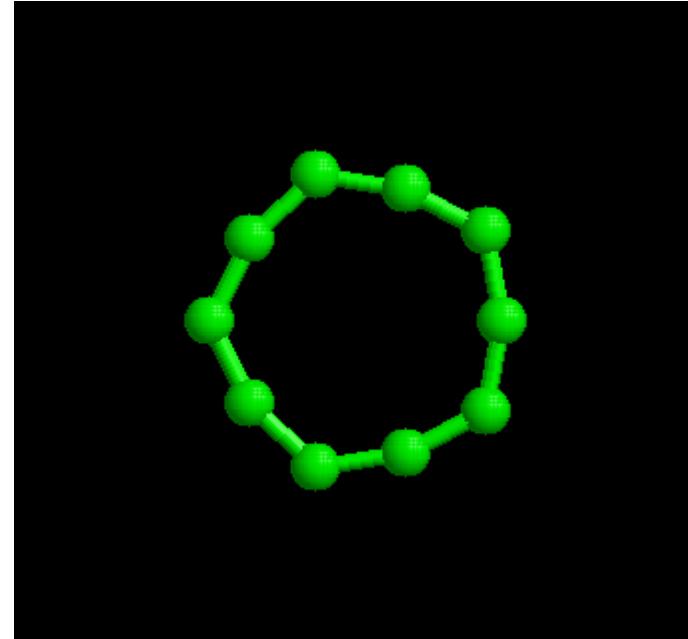
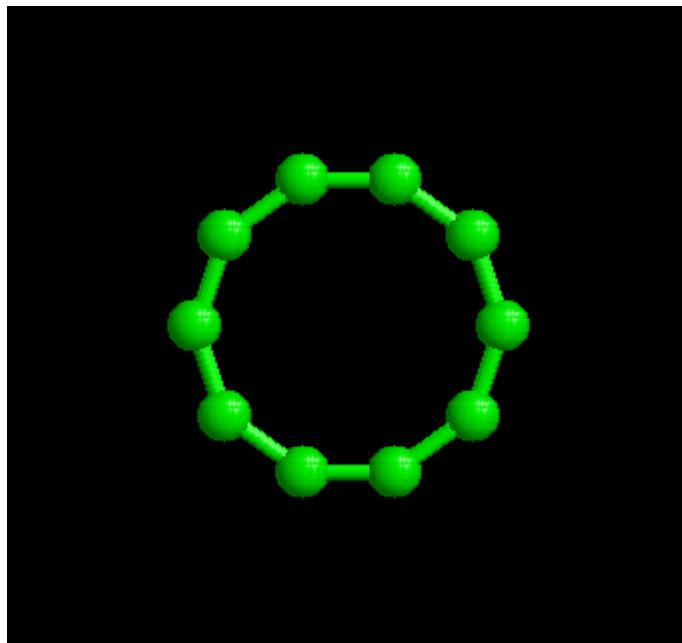
LDA & PBE are inadequate in predicting the relative energy of covalent clusters

II. Simple Metal clusters



DFT is reliable in predicting the relative energy of simple metal clusters

C_{10} : 2D PES



D_{10h}

$\Delta(E)$	= 0.079	eV
	= 0.189 (20)	eV
6-311+g	= 0.174	eV
cc-pVDZ	= 0.295	eV
cc-pVTZ	= 0.160	eV
cc-pVQZ	= 0.147	eV

D_{5h}

CASTEP – LDA
DMC (DFT geometry)

B3LYP

B3LYP

B3LYP

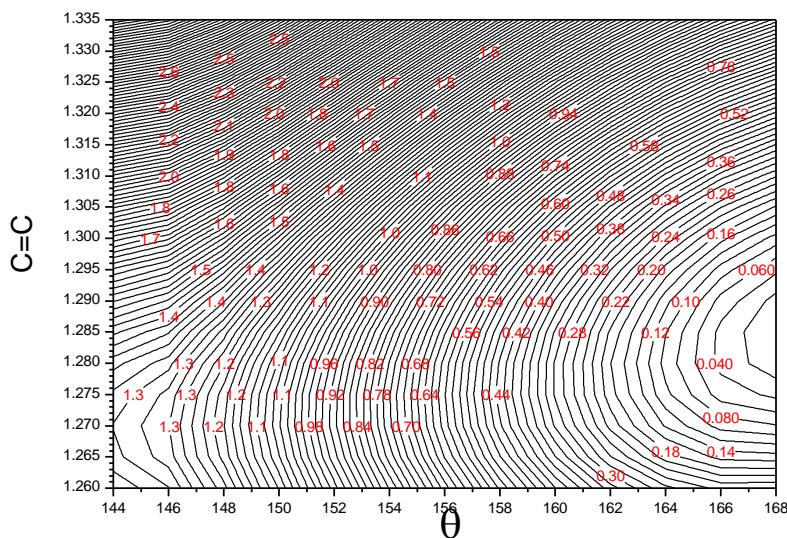
B3LYP

How about Quantum Chemistry Methods: HF, MP2, MP4, CCSD(T)?

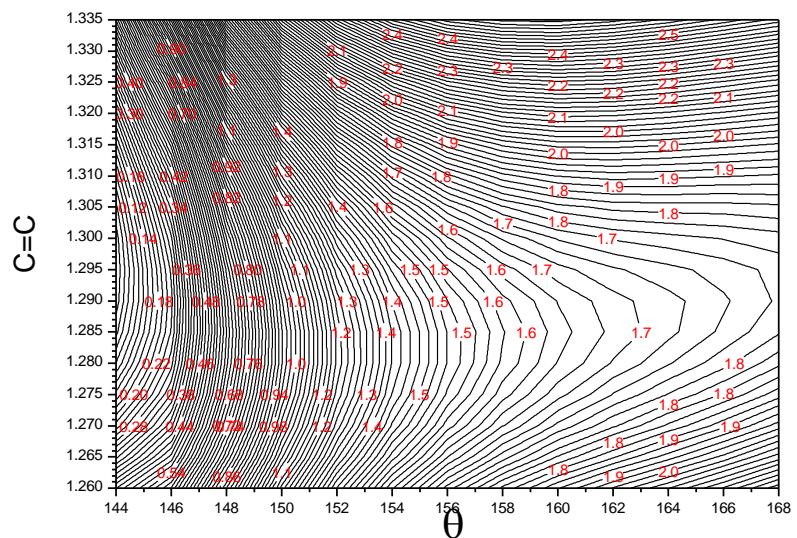
High level methods are more important than increasing local basis sets!

cc-pVTZ

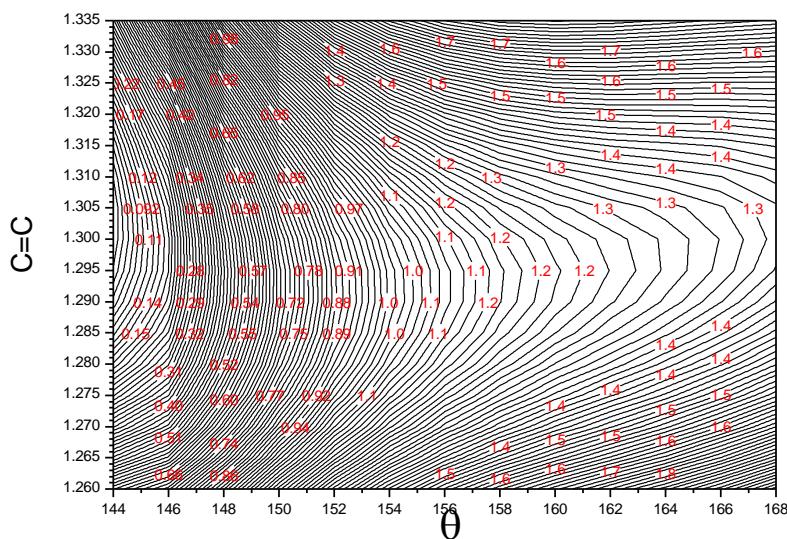
HF



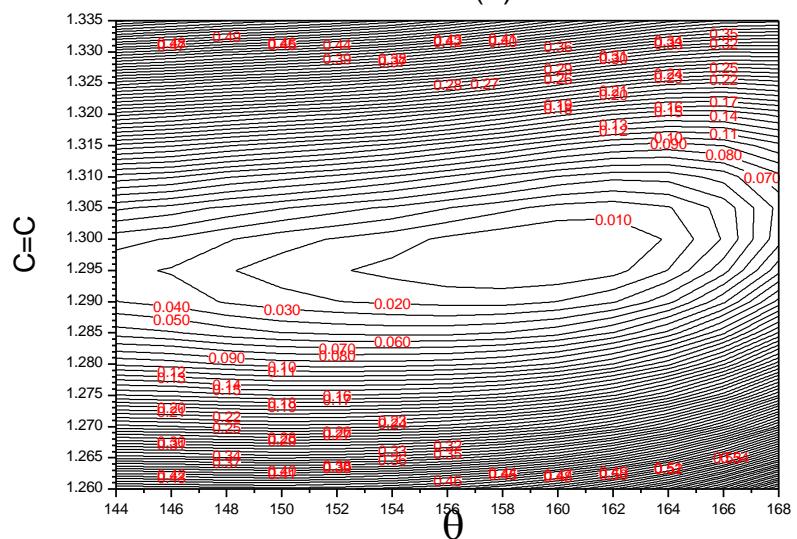
MP2



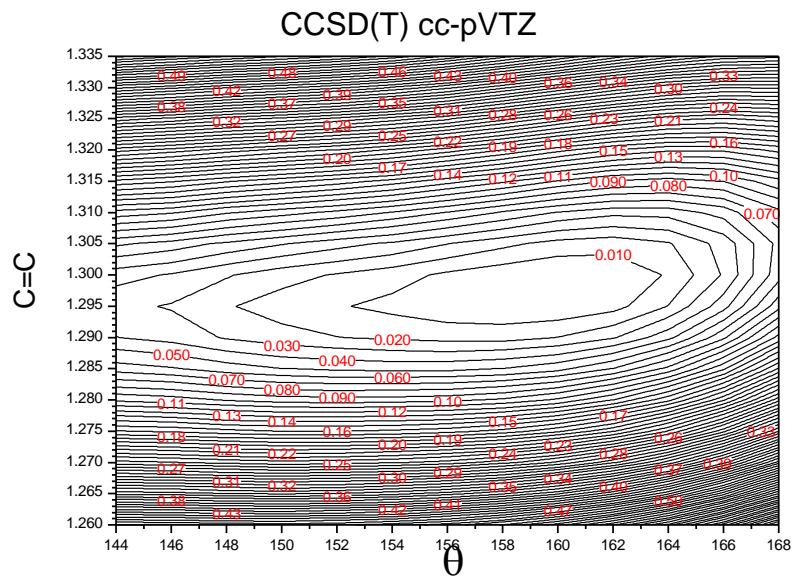
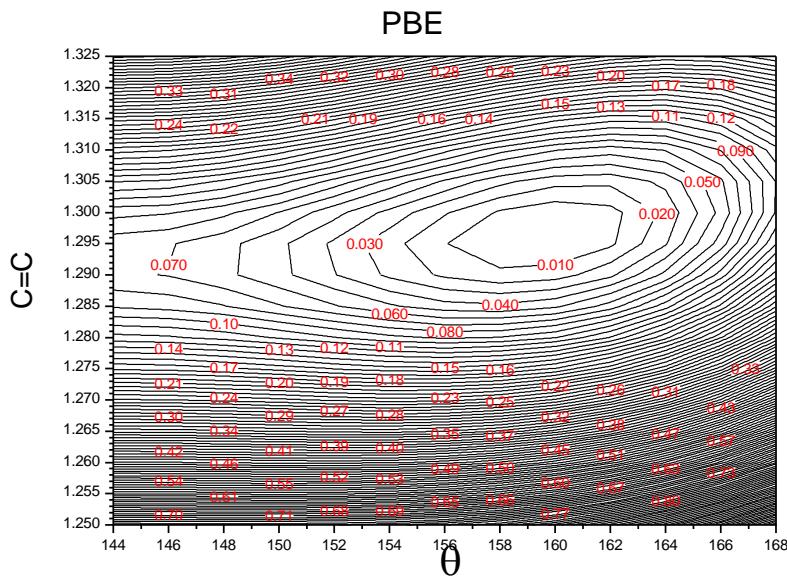
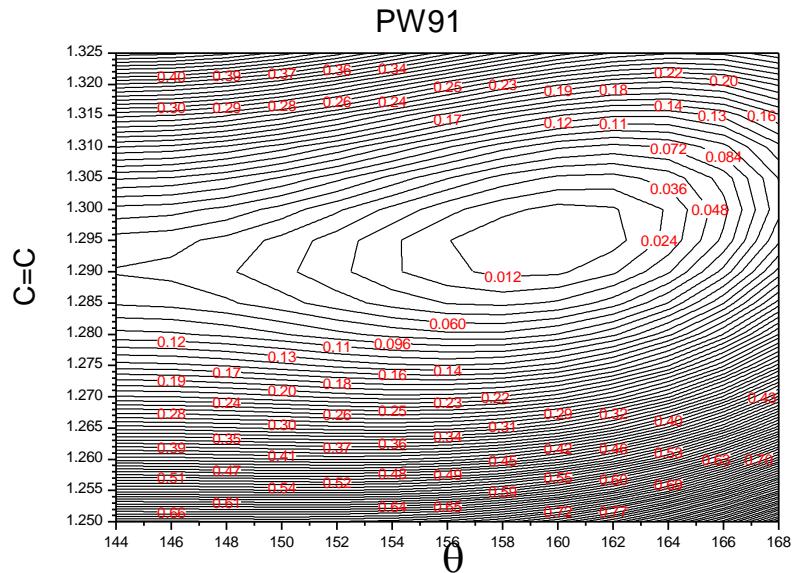
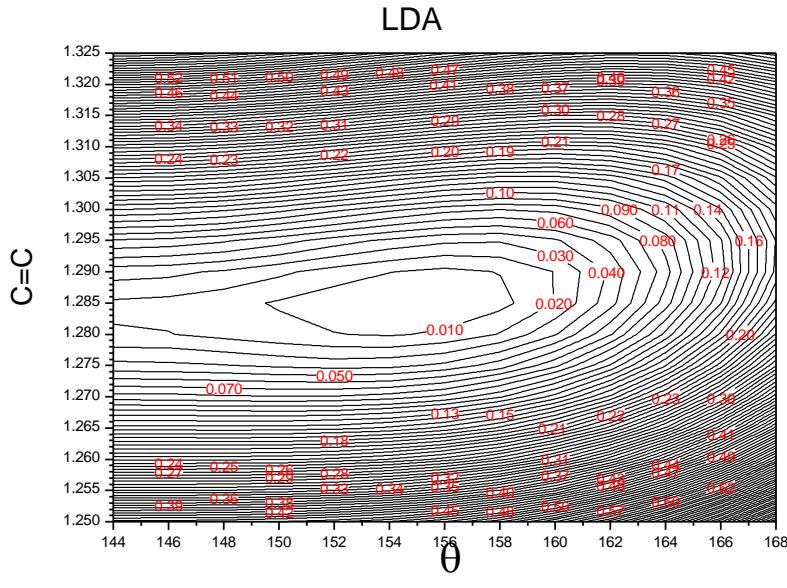
MP4



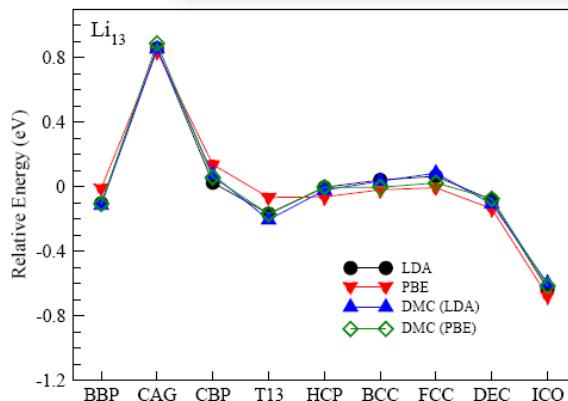
CCSD (T)



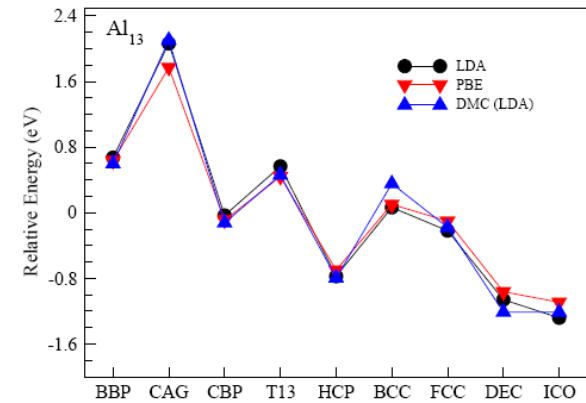
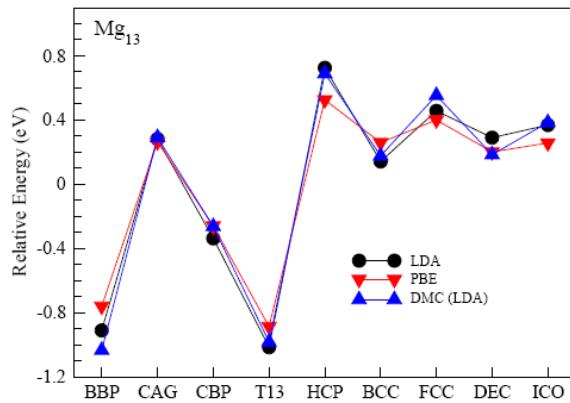
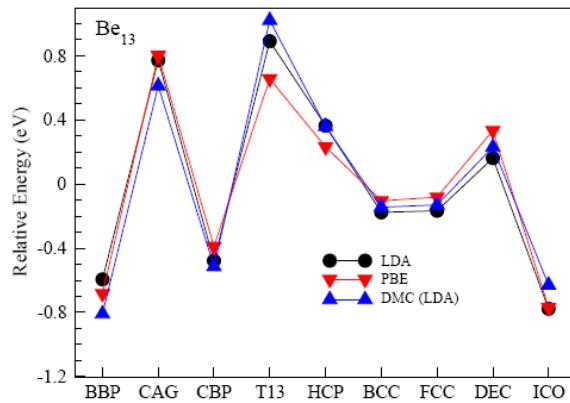
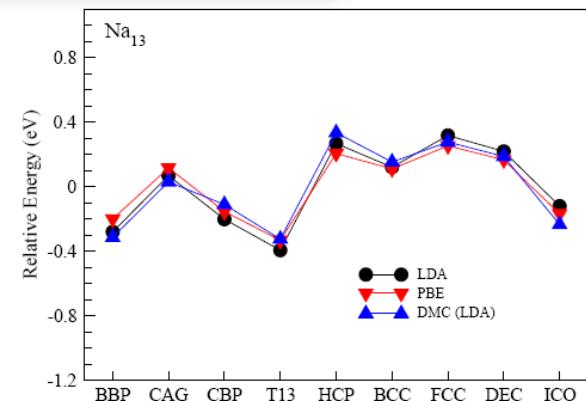
DFT with XC_s are better than HF, MP2 and MP4



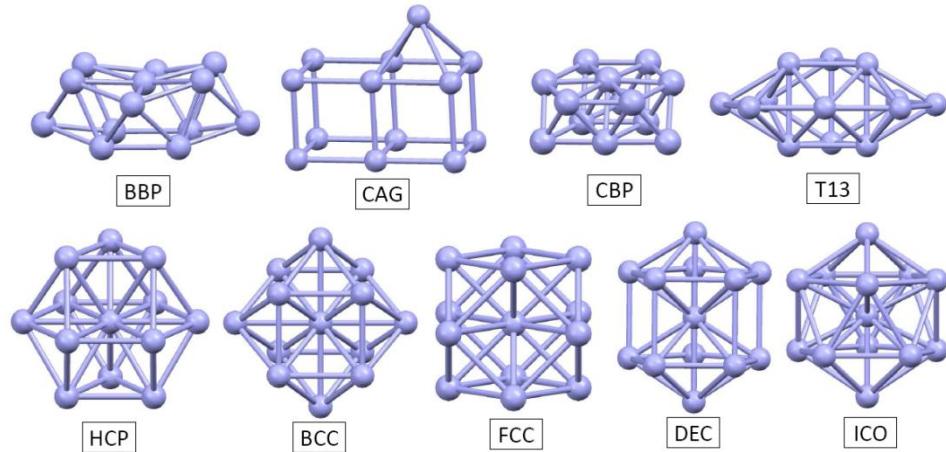
Quantum Monte Carlo Studies of 13-atom Simple Metallic Clusters



DFT is reliable in predicting the relative energy of simple metal clusters!



Cluster	(θ)		L	
	LDA	PBE	LDA	PBE
Li_{13}	4.25	12.23	1.02	1.02
Na_{13}	15.23	15.59	1.01	0.83
Be_{13}	11.57	16.77	0.97	1.09
Mg_{13}	6.76	7.87	0.98	0.81
Al_{13}	7.27	6.00	0.98	0.81



$$\cos \theta = \frac{\vec{\mathcal{D}}^{\text{DFT}} \cdot \vec{\mathcal{D}}^{\text{DMC}}}{|\vec{\mathcal{D}}^{\text{DFT}}| |\vec{\mathcal{D}}^{\text{DMC}}|}$$

$$L = \frac{|\vec{\mathcal{D}}^{\text{DFT}}|}{|\vec{\mathcal{D}}^{\text{DMC}}|}$$

Methodology

A n-dimensional displacement vector

$$\vec{\mathfrak{D}} = (r_1, r_2, \dots, r_n) \text{ Here, } n=9$$

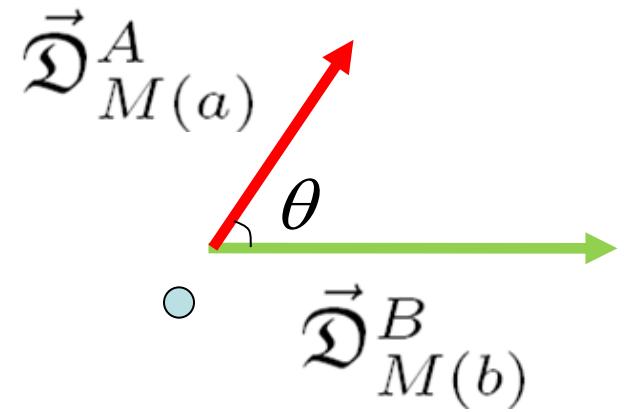
The relative energy definition :

$$r_i = E_i - \bar{E}$$

E_i : the total energy of a certain isomer

\bar{E} : the average energy of all the isomers

$\vec{\mathfrak{D}}_{M(a)}^A$ ← XC functional
M : metal element
(a) : semi-core state



$$\cos(\theta) = \frac{\vec{\mathfrak{D}}_{M(a)}^A \cdot \vec{\mathfrak{D}}_{M(b)}^B}{(|\vec{\mathfrak{D}}_{M(a)}^A| |\vec{\mathfrak{D}}_{M(b)}^B|)} \quad L = \frac{|\vec{\mathfrak{D}}_{M(a)}^A|}{|\vec{\mathfrak{D}}_{M(b)}^B|}$$

If $\cos(\theta)$ & $L = 1$, then DFT and DMC energies differ only by a constant energy shift.

"LSDA" and "PBE" energy correlation parameters are with respect to DMC, while "DMC" is with respect to SJB-DMC.

Cluster	$\cos \theta$			L			σ (eV)	
	LSDA	PBE	DMC	LSDA	PBE	DMC	LSDA	PBE
Li ₁₃	0.9973	0.9773	0.9973	1.02	1.02	0.99	0.03	0.08
Na ₁₃	0.9649	0.9632	–	1.01	0.83	–	0.06	0.07
Be ₁₃	0.9797	0.9574	0.9994	0.97	1.09	0.99	0.12	0.17
Mg ₁₃	0.9930	0.9906	0.9999	0.98	0.81	1.01	0.07	0.13
Al ₁₃	0.9972	0.9976	0.9998	0.98	0.85	1.01	0.08	0.13

$$\cos \theta = \frac{\vec{\mathfrak{D}}^{\text{DFT}} \cdot \vec{\mathfrak{D}}^{\text{DMC}}}{\left| \vec{\mathfrak{D}}^{\text{DFT}} \right| \left| \vec{\mathfrak{D}}^{\text{DMC}} \right|}$$

$$L = \frac{\left| \vec{\mathfrak{D}}^{\text{DFT}} \right|}{\left| \vec{\mathfrak{D}}^{\text{DMC}} \right|}$$

$$\sigma^2 = \frac{1}{n} \left| \vec{\mathfrak{D}}^{\text{DFT}} - \vec{\mathfrak{D}}^{\text{DMC}} \right|^2$$

1. LSDA and PBE functionals are reasonably reliable for studying the energetics of simple metallic clusters.
2. PBE predicts smaller values of L (Na_{13} , Mg_{13} , and Al_{13}) and thus tends to give smaller energy difference than DMC.
3. Backflow lowers the DMC energies but does not affect the relative stabilities of the clusters.

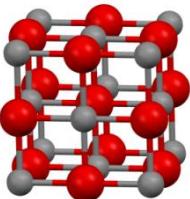
Outline

- *Motivation? Why using QMC?*
- *Material Simulations using QMC*
 - ✓ *covalent and metallic clusters*
 - ✓ ***band gaps of TiO₂, MgO, NaCl***
 - ✓ *surface adsorption on graphene & Al(100)*
 - ✓ *interlayer binding of two BN sheets*
 - ✓ *surface energy: ΔS(DMC) > ΔS(LDA) > ΔS(PBE)*
 - ✓ *O, OH & H₂O adsorption on surfaces*
 - ✓ *CO adsorption on late TM (111) surfaces*

Band Gap by DMC :

MgO (32)

256 electrons



	LDA	DMC	GW	EXP.
E_{gap} (eV)	5.65	8.0(2)	8.2 ^a	7.8 ^b

a. A. Yamasaki *et al.* *Phys. Rev. B* 66, 245108 (2002)

b. R. C. Whited *et al.* *Solid State Commun.* 13, 1903 (1973)

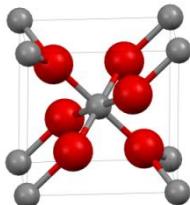
NaCl (32)

512 electrons

	DMC	EXP.
E_{gap} (eV)	8.1(3)	8.9

TiO₂ (16+32)

384 electrons

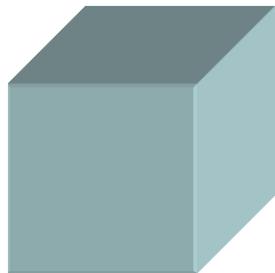


	LDA	DMC	GW	EXP.
E_{gap} (eV)	0.48	3.8(3)	3.78 ^a	3.1 ^b

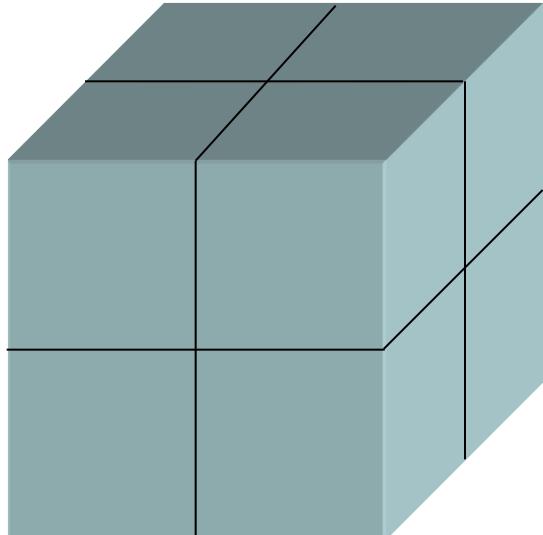
a. M. Van Schilfgaarde *et al.* *Phys. Rev. Lett.* 96, 226402 (2006)

b. A. Amtout and R. Leonelli *Phys. Rev. B* 51, 6842 (1995)

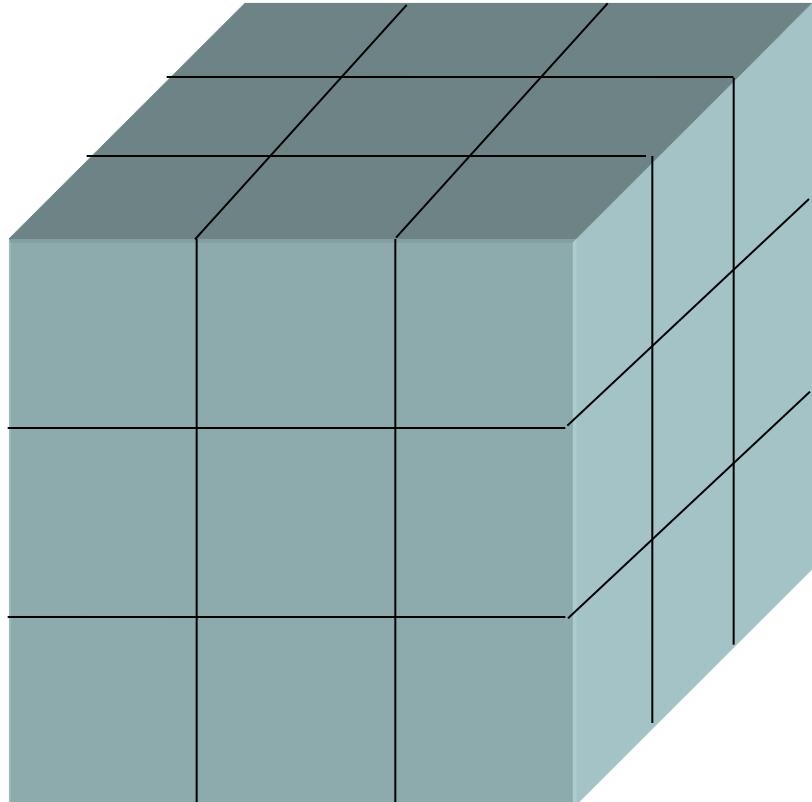
Supercell



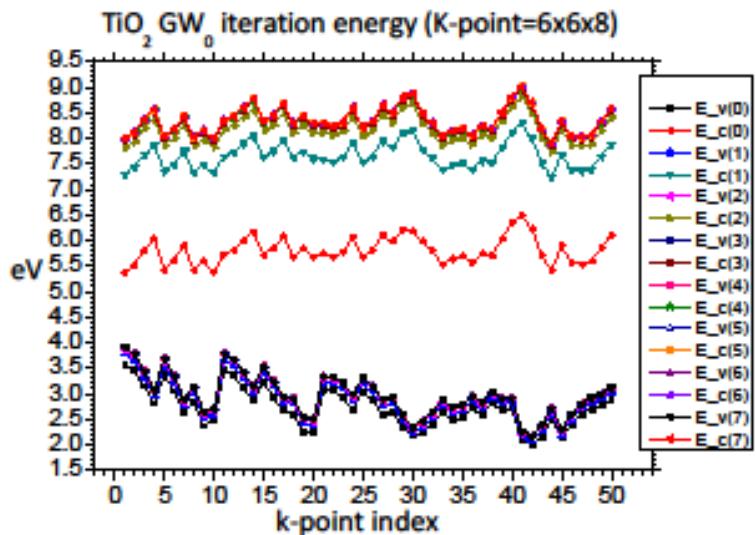
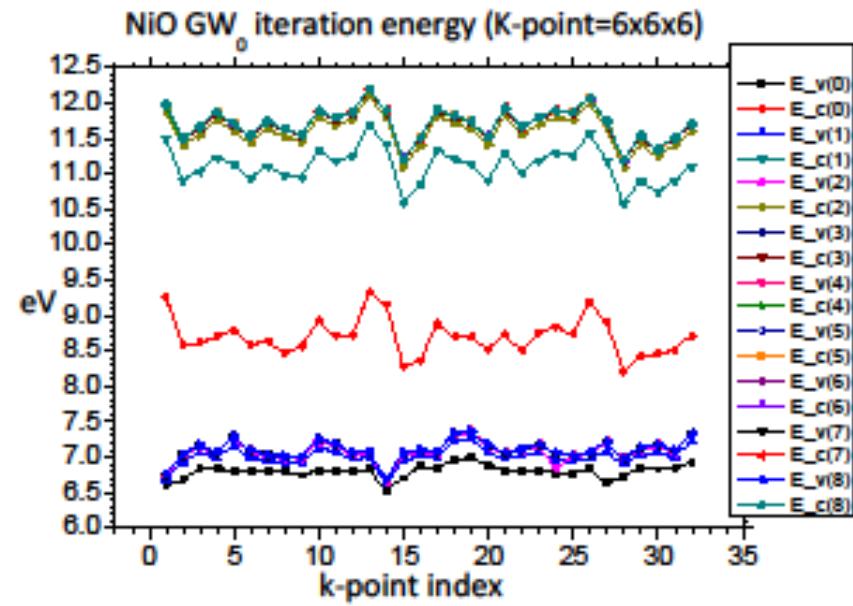
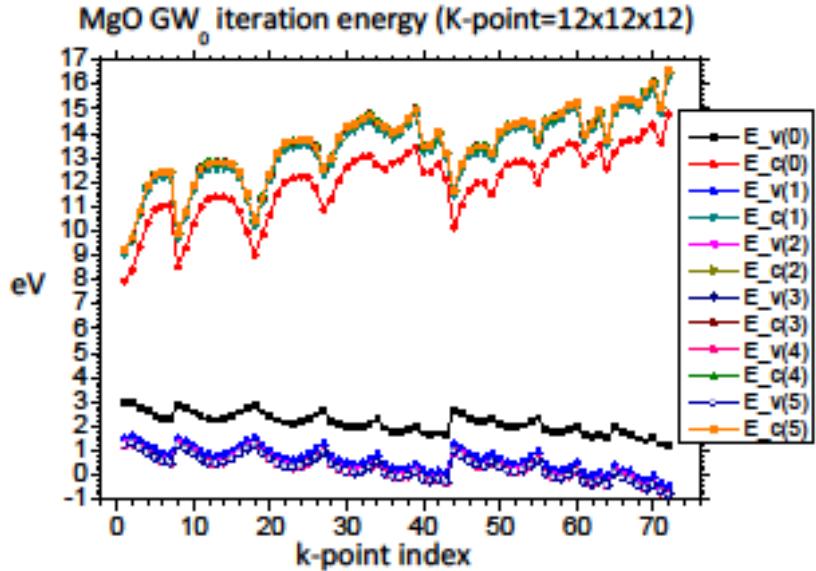
Unit cell
GW



2x2x2
DMC



3x3x3
DMC

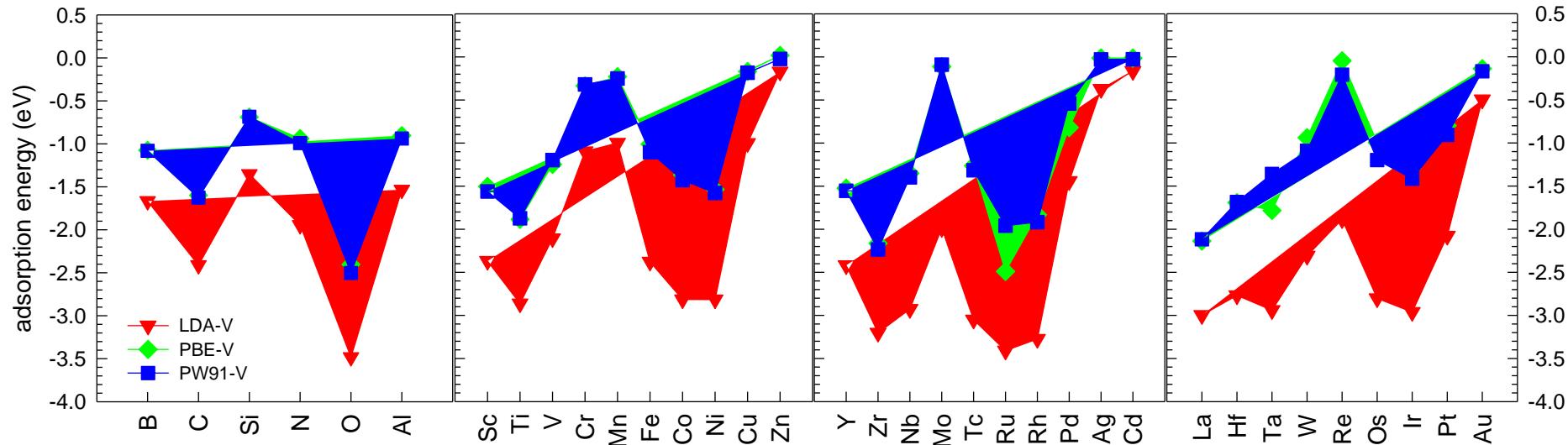


**For band gap calculations,
try “NOT” to use QMC, but
use GW calculations!**

Outline

- *Motivation? Why using QMC?*
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Single atom @ graphene



**LDA & GGA predict different adsorption energy
at preferred adsorption site!**

Except for Zn & Cd atom, the adsorption energy difference obtained by LDA and GGA is ranging from 0.4 ~ 1.8 eV.

**QMC is needed to check the accuracy of
exchange-correlation approximations !**

First-principles study of metal adatom adsorption on graphene

Kevin T. Chan,^{1,2} J. B. Neaton,³ and Marvin L. Cohen^{1,2}

¹*Department of Physics, University of California, Berkeley, California 94720, USA*

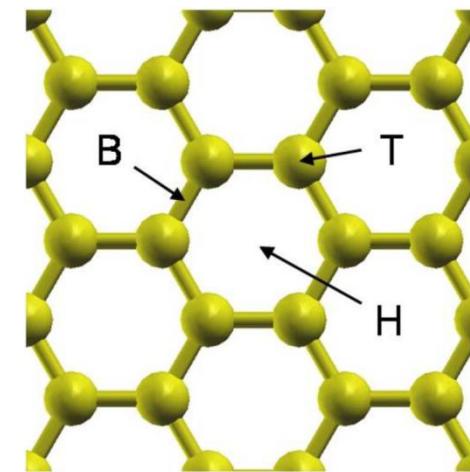
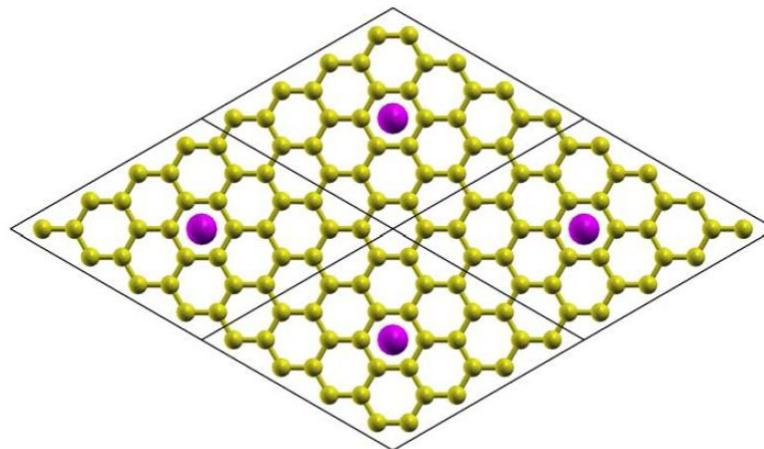
²*Materials Sciences Division, Lawrence Berkeley National Laboratory, Berkeley, California 94720, USA*

³*The Molecular Foundry, Lawrence Berkeley National Laboratory, Berkeley, California 94720, USA*

(Received 30 April 2008; published 20 June 2008)

VASP-PBE

Li, Na, K, Ca, Al, Ga, In, Sn, Ti, Fe, Pd, Au



DFT : primitive unit cell with the k-point set summation
DMC: many-body unit cell with only one special k-point

O adsorption on Graphene

- K-point = (-1/2,1/2) (1/2,1/2) 2x2x1
- E_{ads}(DFT) = -3.130 -3.679 -3.405 eV
- E_{ads}(DMC) = -1.059 -1.816 -1.437 eV

- K-point = (0,0) (-1/3,1/3) (1/3,0) (1/3,1/3) 3x3x1
- E_{ads}(DFT) = -3.190 -4.158 -3.373 -3.031 -3.451 eV
- E_{ads}(DMC)= -1.151 -2.298 -1.476 -0.919 -1.499 eV

Over-binding effect predicted by LDA is ~ 2eV

In order to check the dependence of binding energies on the "special k-point", here we show the DFT and DMC adsorption energy results of single O atom on graphene (see table below).

(eV)	E(0,0)	E(-1/3,1/3)	E(1/3,0)	E(1/3,1/3)	Twist ave.
E _{ads} (DMC)-E _{ads} (DFT)	2.039	1.860	1.897	2.112	1.952

$$\text{Twist ave.} = E(0,0)/9 + E(-1/3,-1/3)*2/9 + E(1/3,0)*4/9 + E(1/3,1/3)*2/9$$

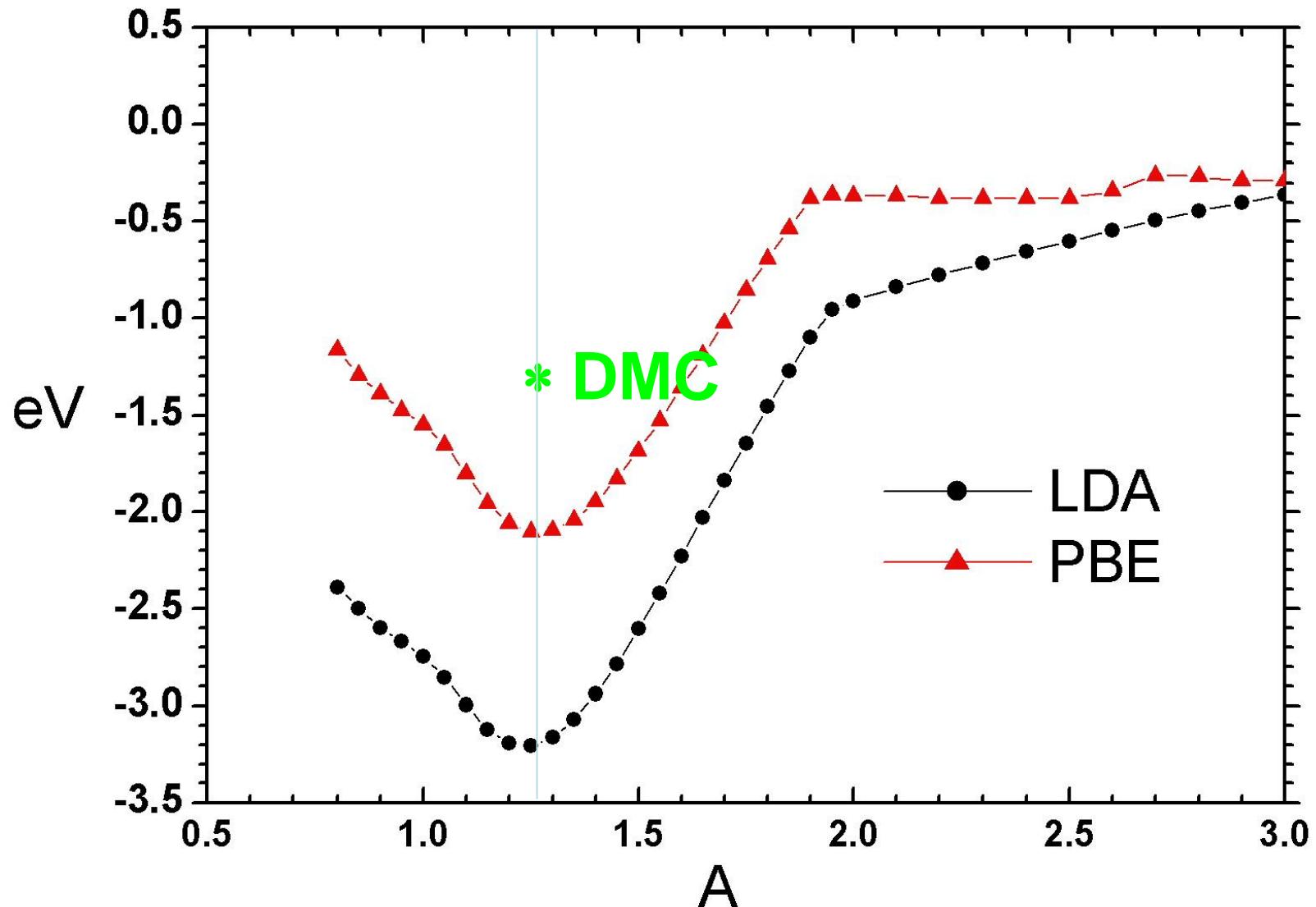
(eV)	E(-1/2,1/2)	E(1/2,1/2)	Twist ave.	(1/2,0) Zone
E _{ads} (DMC)-E _{ads} (DFT)	2.071	1.863	1.968	1.811

$$\text{Twist ave.} = E(-1/2,1/2)*1/2 + E(1/2,1/2)*1/2$$

1. E(p,q) means the adsorption energy difference obtained at special k-point (p,q)
2. (0,0) , (-1/3,1/3) , (1/3,0) and (1/3,1/3) are four symmetry irreducible k points obtained from the Monkhorst-Pack 3x3 k-point set.
3. (-1/2,1/2) and (1/2,1/2) are two symmetry irreducible k points obtained from the Monkhorst-Pack 2x2 k-point set.
4. The twist average is the weighted average from independent special k points.

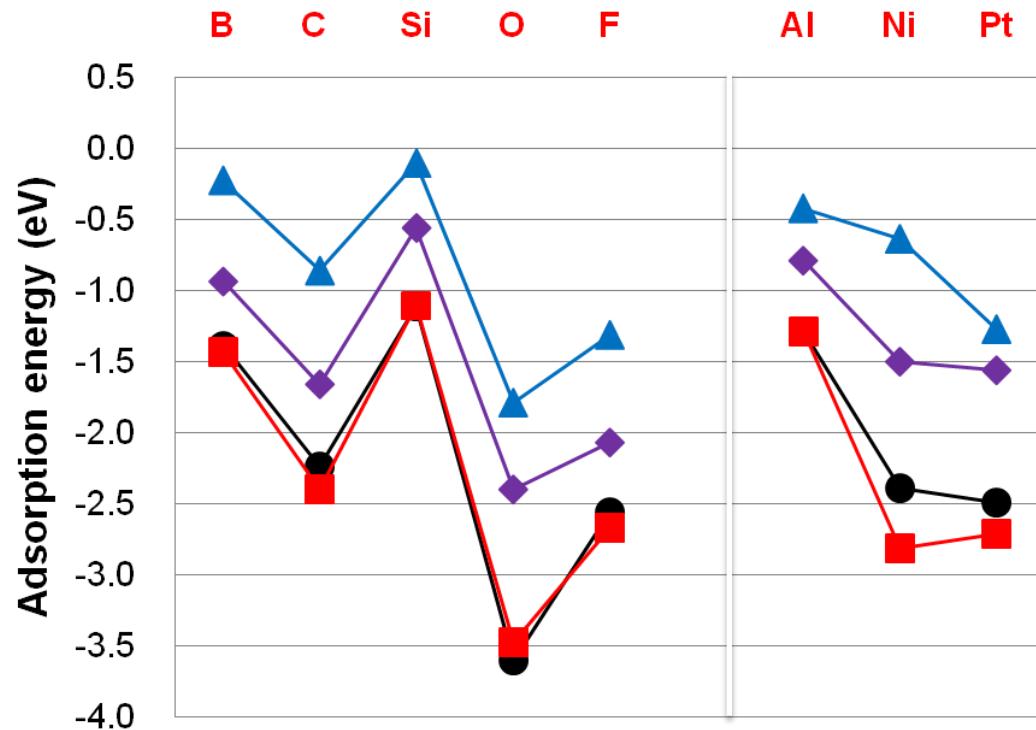
From above table, one can see the binding energy difference obtained from DFT and DMC is nearly independent of the choice of the special k point and this good property has ensured the correctness of the DMC results based on one selected special k point.

Adsorption energy of O on graphene



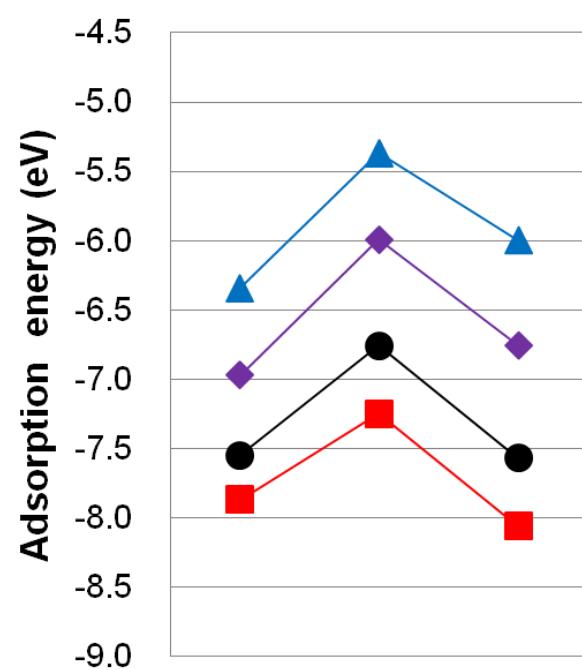
Single atom@graphene & Al(100)

atom@graphene



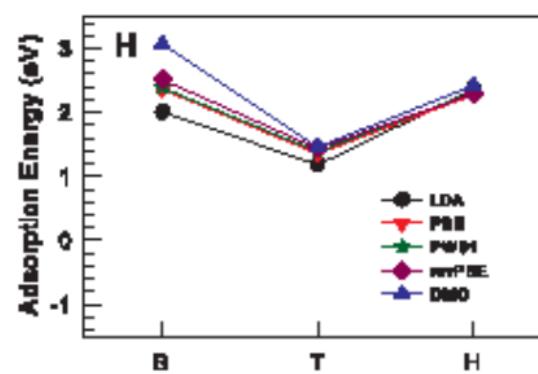
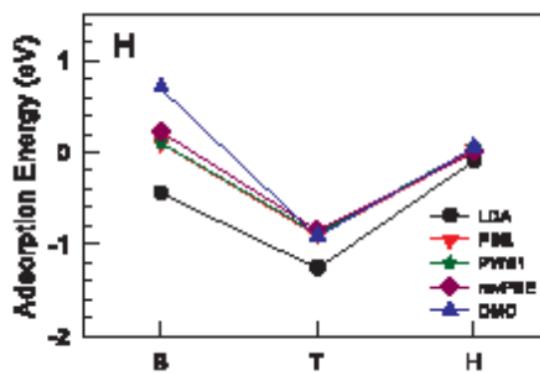
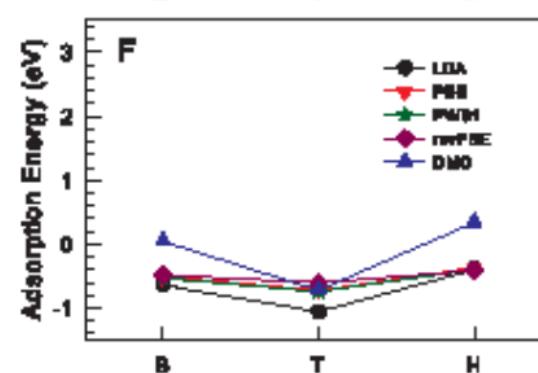
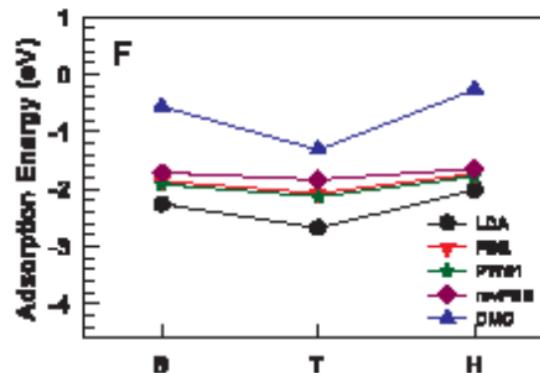
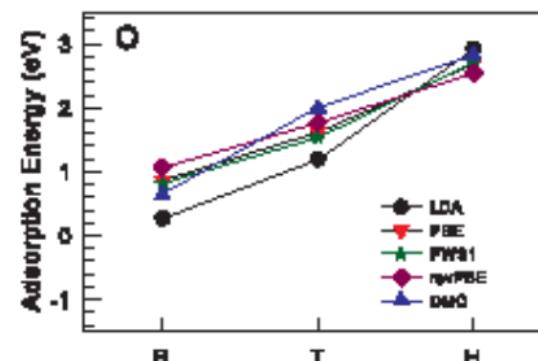
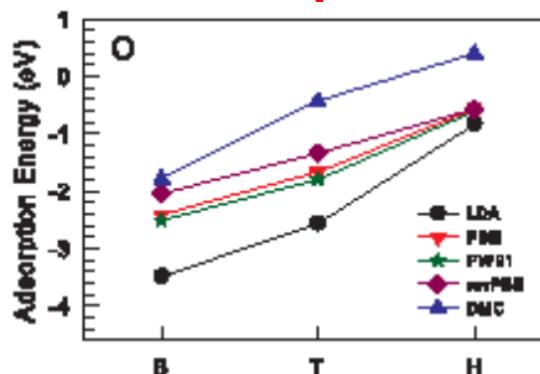
LDA overbinding 0.9~1.8 eV
GGA overbinding 0.3~0.9 eV

atom@Al(100)



LDA overbinding ~1.5 eV
GGA overbinding ~0.7 eV

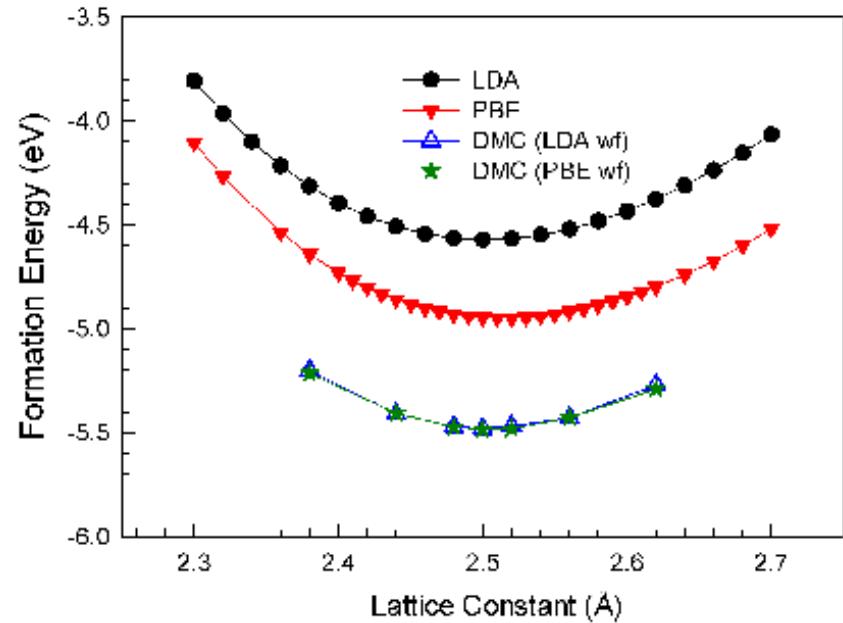
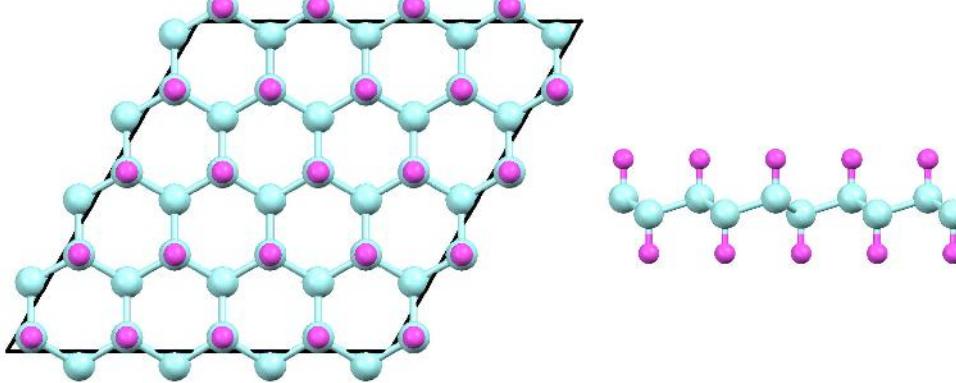
Adsorption energies of a single O, F and H atom at different adsorption sites on graphene are compared.



energies with respect
to an isolated atom

energies with respect
to an isolated molecule

Formation energies of graphane as a function of the lattice constant

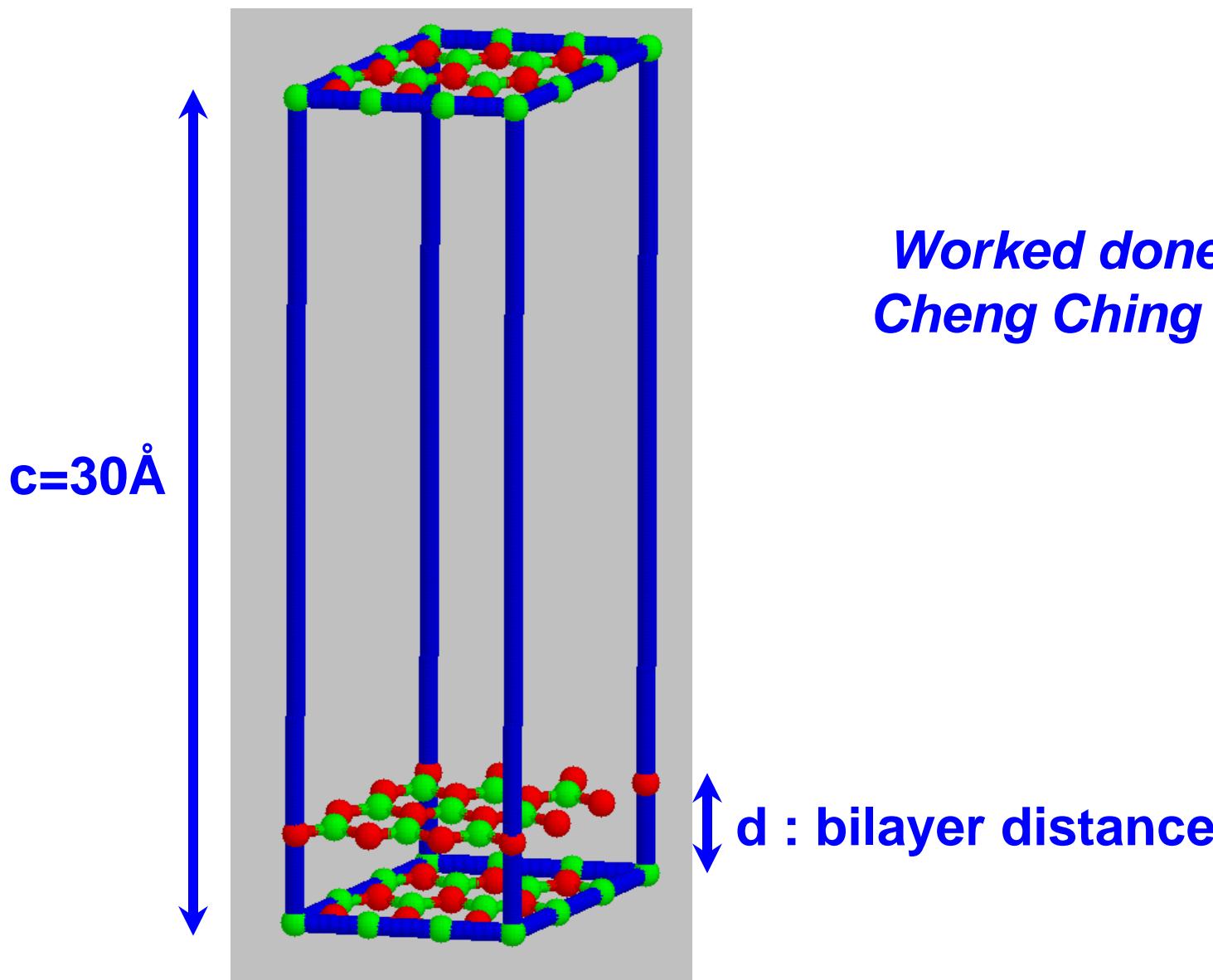


1. *The DMC calculation gives a lattice constant of 2.50 Å, which is greater than that of graphene (2.46 Å).*
2. *This value is larger than the reported experimental value of 2.42 Å in a TEM measurement. This could be arisen from the substrate interaction.*

Outline

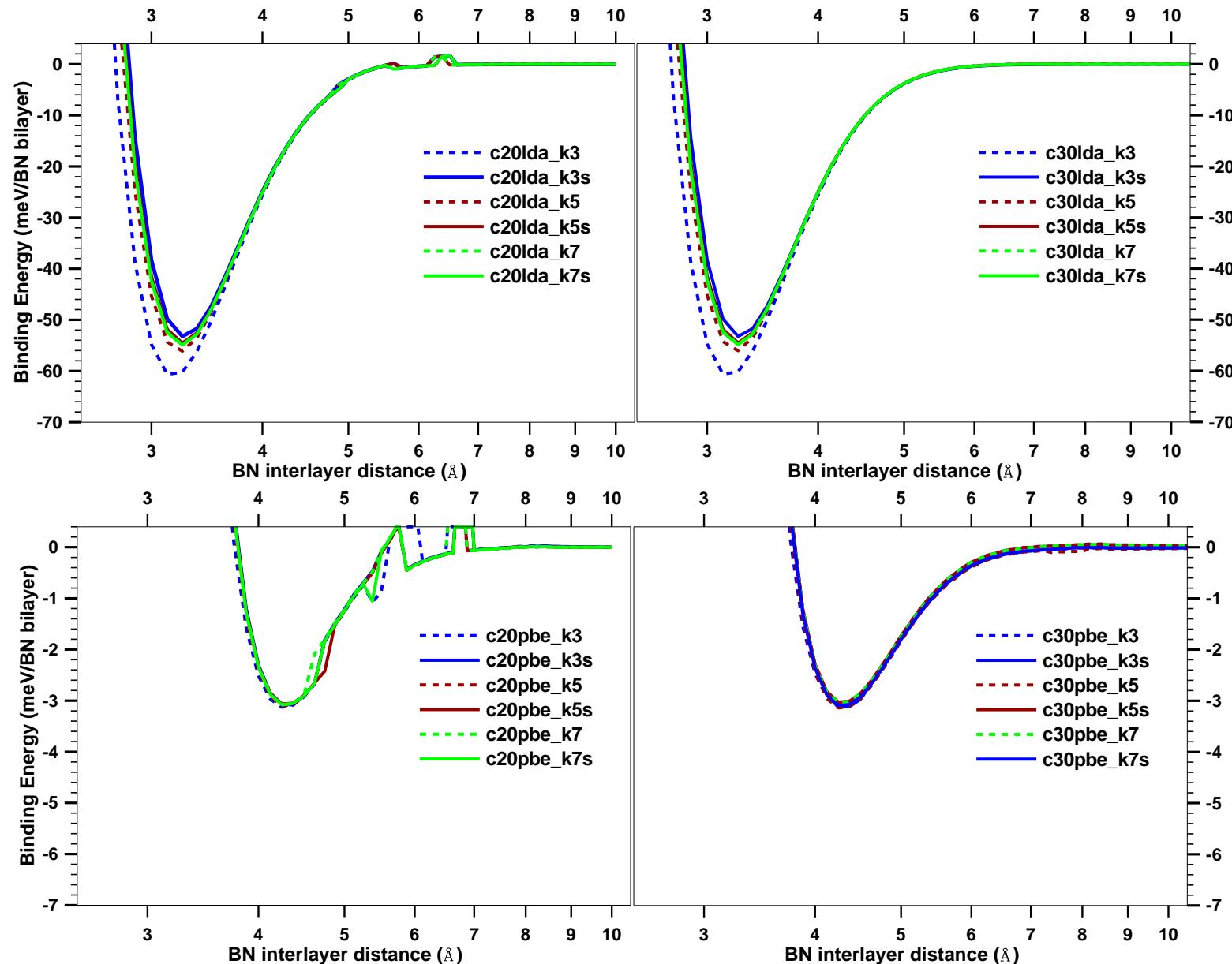
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BN bilayer : supercell structure



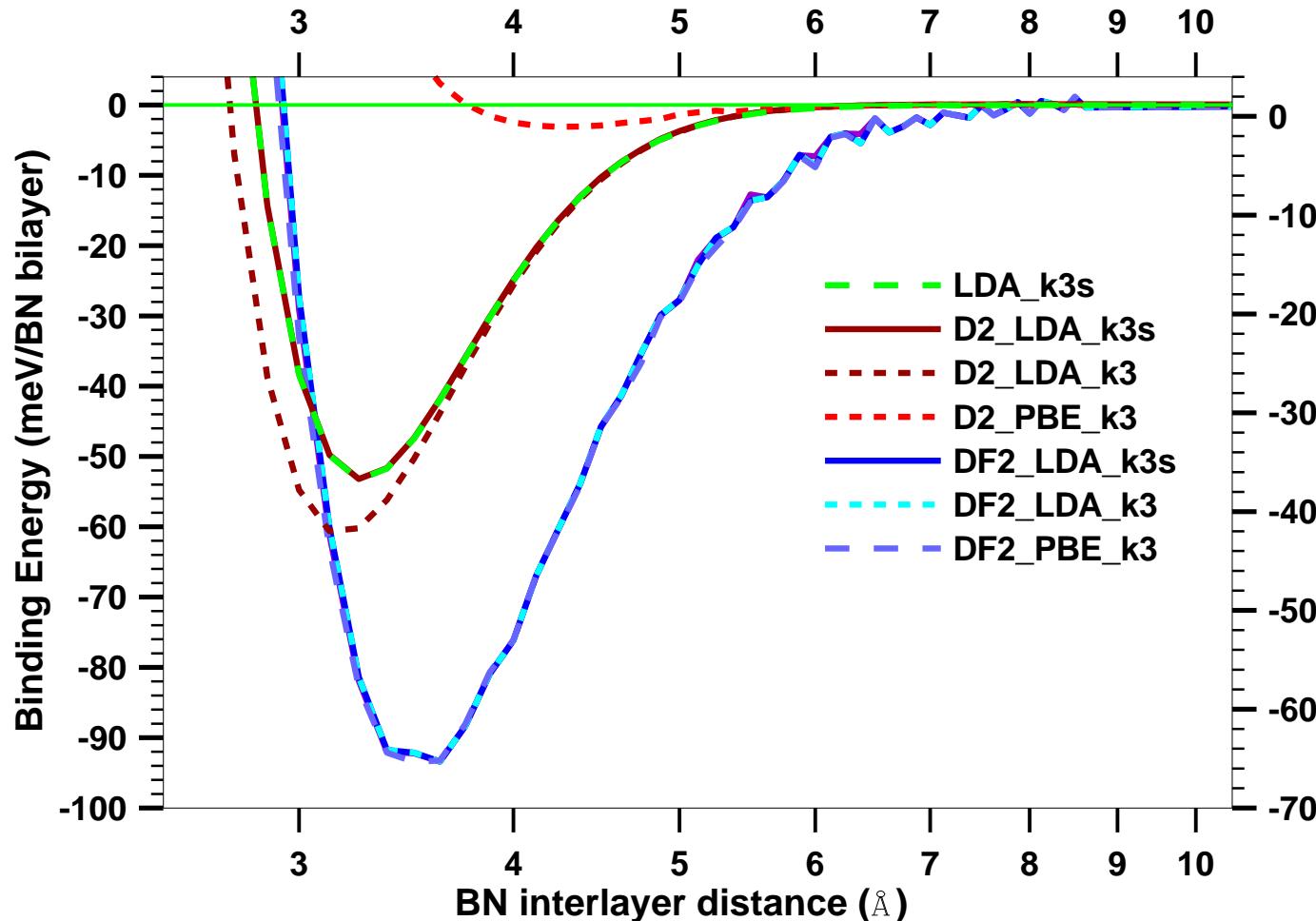
*Worked done by Dr.
Cheng Ching (NCKU)*

DFT_LDA & DFT_GGA : effect of c and k points



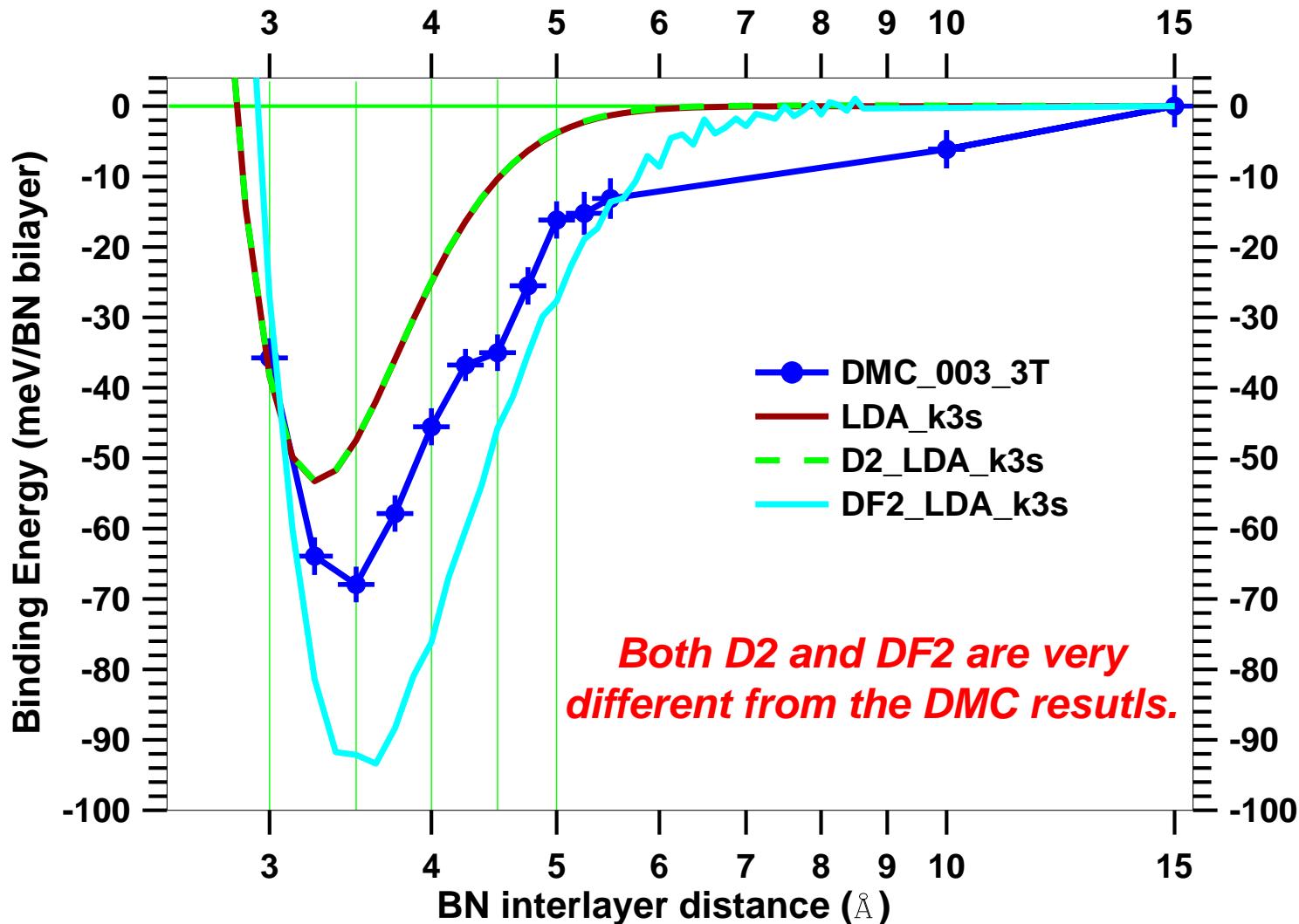
DFT_vdW : D2 and DF2 (and LDA)

- ◆ D2: S. Grimme, ``*Semiempirical GGA-type density functional constructed with a long-range dispersion correction*'', J. Comp. Chem. 27, 1787 (2006).
- ◆ DF2: K. Lee, E. D. Murray, L. Kong, B. I. Lundqvist, and D. C. Langreth, Phys. Rev. B **82**, 081101 (2010).



DMC v.s. vdW_DFT v.s. LDA

- ◆ D2: S. Grimme, J. Comp. Chem. 27, 1787 (2006).
- ◆ DF2: K. Lee, E. D. Murray, L. Kong, B. I. Lundqvist, and D. C. Langreth, Phys. Rev. B **82**, 081101 (2010).

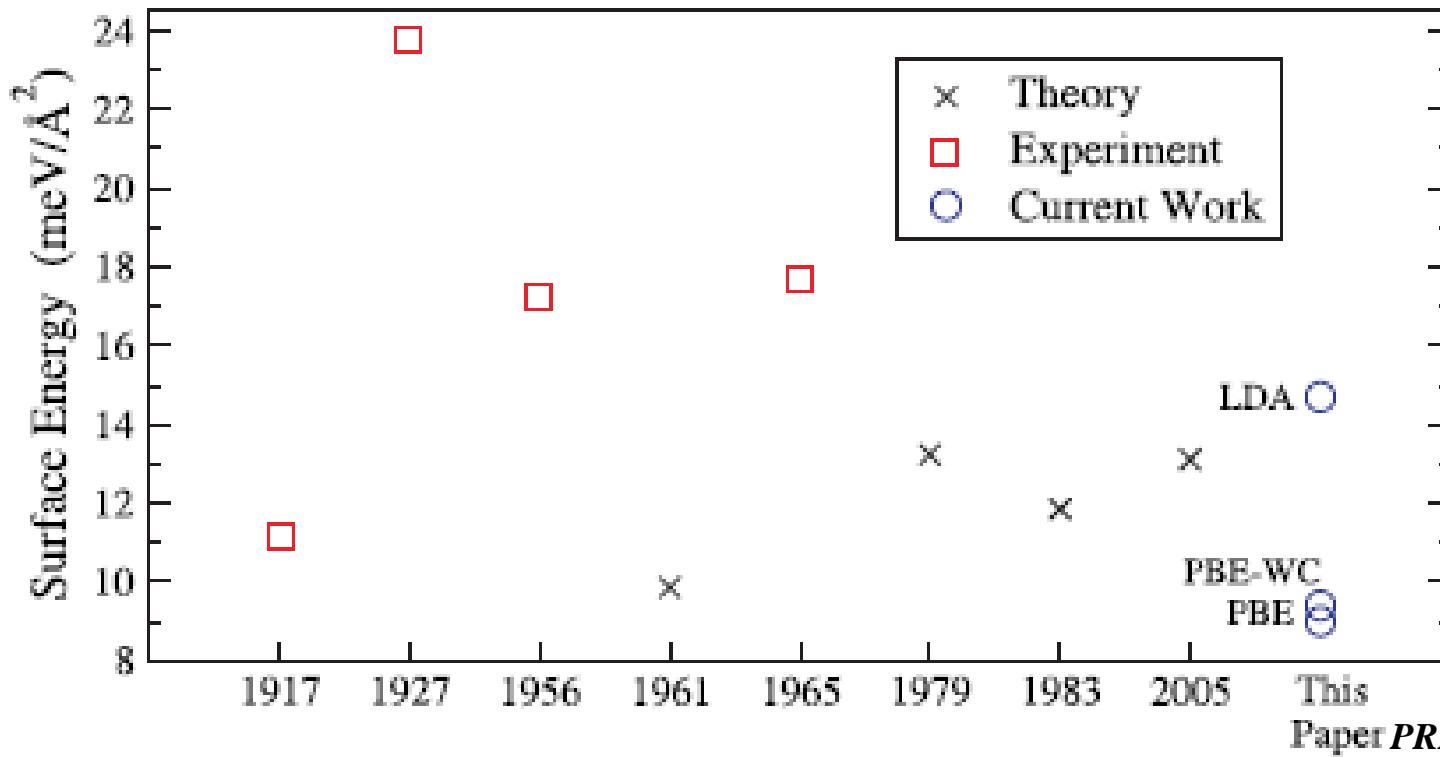


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 - ✓ *CO adsorption on late TM (111) surfaces*

Why study surface energy?

- Surface energy is a fundamental quantity !
- Surface energy is difficulty to measure !



Can one obtain reliable Surface Energy using QMC?

LETTER TO THE EDITOR

The energetics of oxide surfaces by quantum Monte Carlo

D Alfè^{1,2,3} and M J Gillan^{2,3}

Abstract

Density functional theory (DFT) is widely used in surface science, but for some properties the predictions depend strongly on the approximation used for exchange–correlation energy. We note recent suggestions that the widely used generalized gradient approximation (GGA) is inferior to the local density approximation (LDA) for the surface formation energy σ of both transition metals and oxides. We report quantum Monte Carlo calculations of σ for the MgO(001) surface which support the accuracy of LDA for this case, and indicate that GGA is too low by $\sim 30\%$. We point out the potentially important implications of this result for nanoscience modelling.

MgO(001) – surface energy

DFT input : (with exp. lattice constant $a_0=4.21\text{\AA}$)

1. periodic cell dimension : surface	$a_0/\sqrt{2} \times a_0/\sqrt{2} \times 5a_0$	(5 MgO layers + 5 vacuum)
bulk1	$a_0/\sqrt{2} \times a_0/\sqrt{2} \times 2a_0$	(4 MgO layers)
bulk2	$a_0/\sqrt{2} \times a_0/\sqrt{2} \times 5a_0$	(10 MgO layers)

Energy difference per MgO for bulk1 and bulk2 is only 2.7 meV, thus it is safe to use surface and bulk1 to calculate the surface energy.

2. Ecut : 3000 eV

3. XC functional : LDA

DMC input : (following DFT input)

1. supercell : 2x2x1

2. time step = 0.01

3. number of moves = 30,000

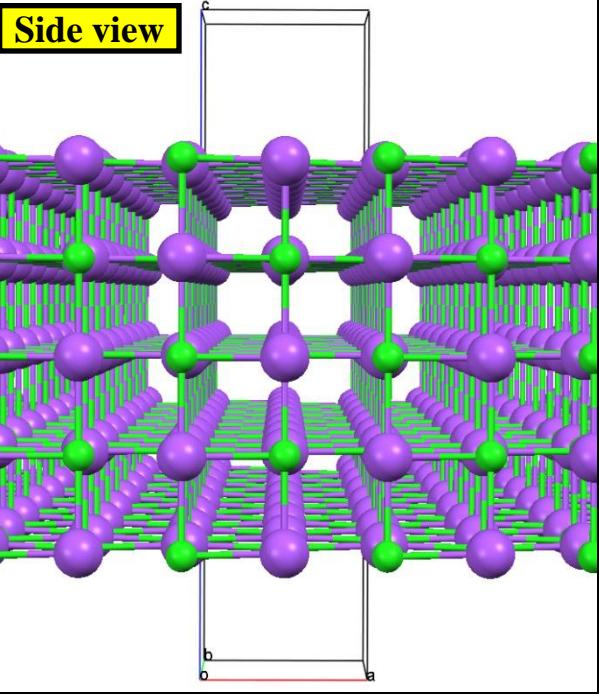
Exp. : $1.04 \sim 1.20 \text{ joule/m}^2$

Surface formation energy (joule/m²)

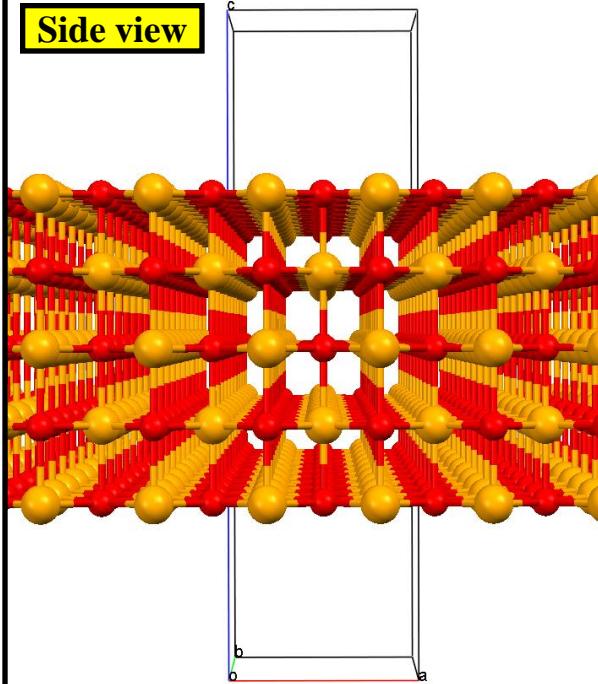
LDA-221K	LDA-661K	PBE-221K	PBE-661K	DMC-221K (He-core)	DMC-221K (Ne-core)
1.094	1.179	0.735	0.860	1.238	1.181

1. LDA-221K means the DFT-LDA calculation using 2x2x1 k-point mesh
2. DMC result is using He-core for Mg pseudopotential
3. DMC-2e result is using Ne-core for Mg pseudopotential
4. DMC & DMC-2e statistical error are about 0.05 joule/m²

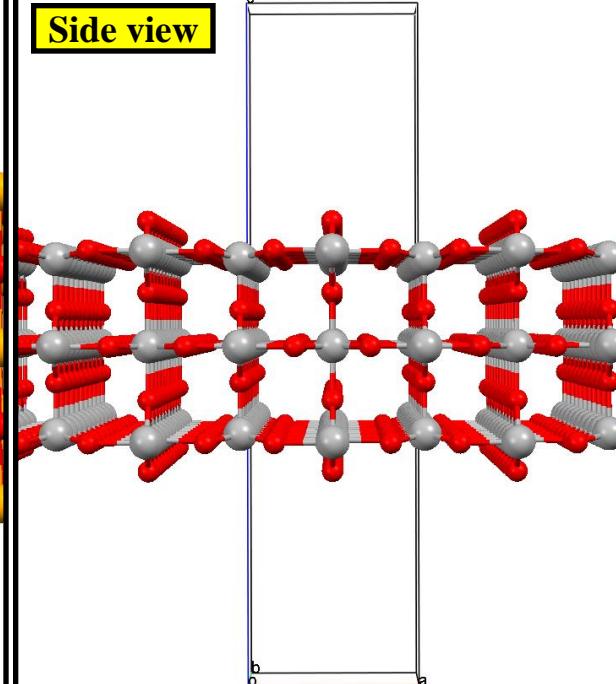
NaCl



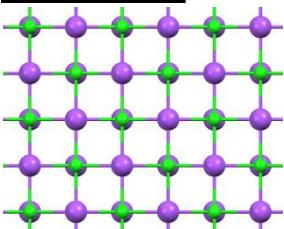
MgO



TiO₂

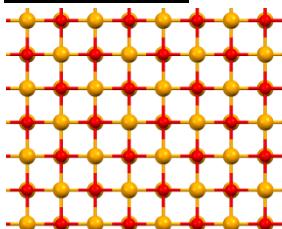


Top view



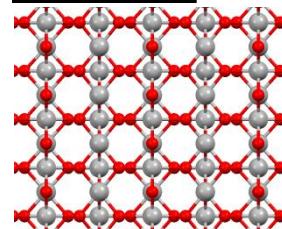
● Na atom
● Cl atom

Top view



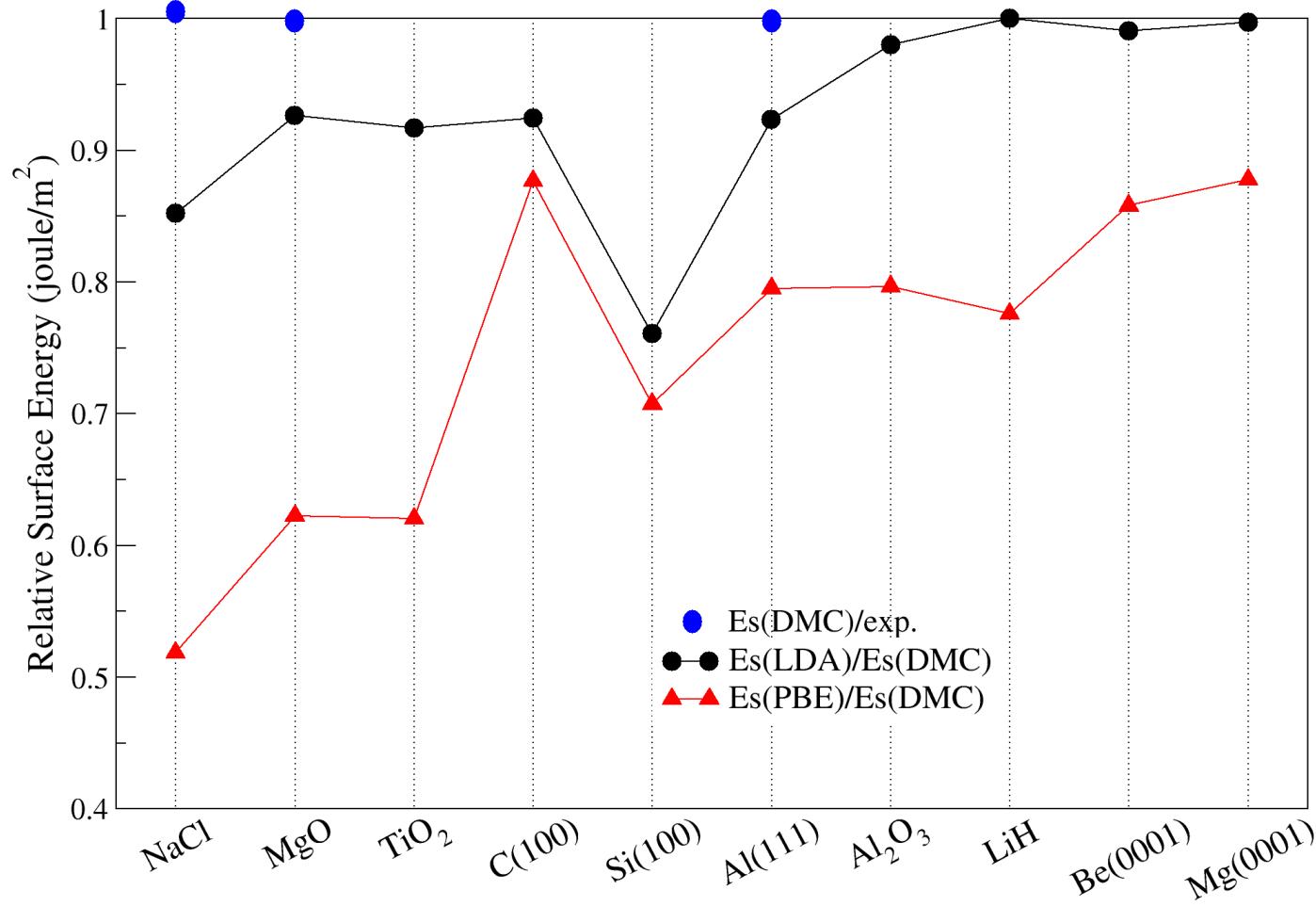
● Mg atom
● O atom

Top view



● Ti atom
● O atom

$$\Delta S(\text{DMC}) > \Delta S(\text{LDA}) > \Delta S(\text{PBE})$$



- (1) For NaCl, MgO and Al(111), DMC results reproduce experimental data accurately.
 (2) The surface energies predicted by LDA and PBE functionals are underestimated.



ELSEVIER

Surface Science 385 (1997) 386–394

surface science



$\Delta S(DMC) > \Delta S(LDA) > \Delta S(PBE) > \Delta S(Expt)$???

A systematic study of the surface energetics and structure of
 $TiO_2(110)$ by first-principles calculations

S.P. Bates *, G. Kresse, M.J. Gillan

INSTITUTE OF PHYSICS PUBLISHING

JOURNAL OF PHYSICS: CONDENSED MATTER

J. Phys.: Condens. Matter 18 (2006) 4207–4217

[doi:10.1088/0953-8984/18/17/009](https://doi.org/10.1088/0953-8984/18/17/009)

The energetics and structure of rutile $TiO_2(110)$

A Kiejna¹, T Pabisiak¹ and S W Gao²

These numbers are in line with the recent results obtained with the same code (GGA-PW91: 0.56 J m^{-2} [11]). Earlier calculations [3–9] gave substantially larger values of σ , falling in the ranges 1.10 J m^{-2} and 0.83 J m^{-2} (LDA, 3L and 6L slabs, respectively [3]), 0.84 J m^{-2} (LDA, 6L [8]), 0.73 J m^{-2} (GGA-PW91, 7L [6]), 0.80 J m^{-2} (GGA-PW91, 6L [9]), 0.81 J m^{-2} (GGA-PW91, 3L [7]); 1.14 J m^{-2} , and 0.82 – 0.84 J m^{-2} (3L, LDA, and GGA, respectively [4]), 0.84 J m^{-2} (GGA, 3L [5]), with the exception of a considerably lower value of 0.31 J m^{-2} , reported for a 6L slab calculation within GGA-PBE [8]. The empirical estimate of the surface energy is 0.28 – 0.38 J m^{-2} [29]. In most cases cited above the overestimation of the surface

Outline

- *Motivation? Why using QMC?*
- *Material Simulations using QMC*
 - ✓ *covalent and metallic clusters*
 - ✓ *band gaps of TiO_2 , MgO , $NaCl$*
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 - ✓ *interlayer binding of two BN sheets*
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 - ✓ ***O, OH & H_2O adsorption on surfaces***
 - ✓ *CO adsorption on late TM (111) surfaces*

Adsorption and dissociation of ammonia on Au(111) surface: A density functional theory study

Table 1

Adsorption energy^a of different groups on the gold surface (kJ/mol)

	Top	Bridge	hcp	fcc
NH ₃	-25.94 (-26 ^b)			-11.72
NH ₂	-174.27	-199.01		-194.23
NH			-329.09	-349.07
N	-291.94		-463.31	-489.82
H ₂ O	-10.81			
OH	-206.78	-224.84	-201.30	-203.34
O	-286.60		-391.74	-409.84
H	-266.44	-280.12	-285.06	-289.64

^a Only minimal energies are listed.

^b See literature [23].

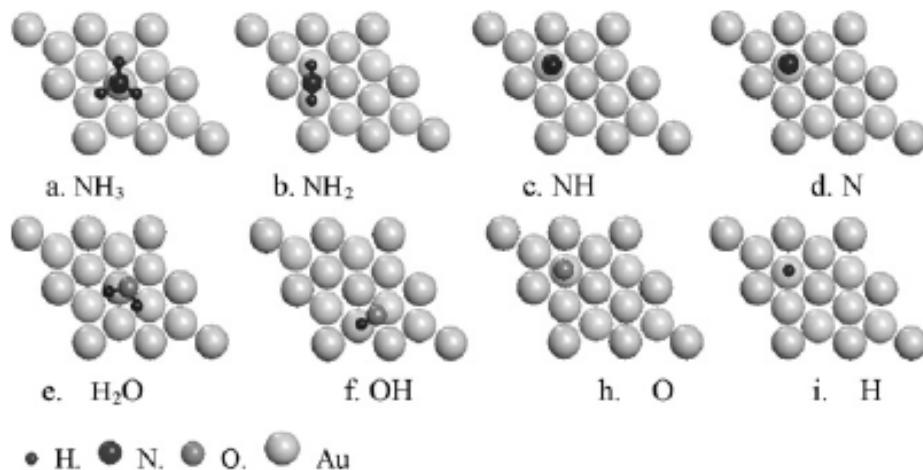


Fig. 1. Adsorbed different groups on top, bridge, fcc positions on Au(111) surfaces.

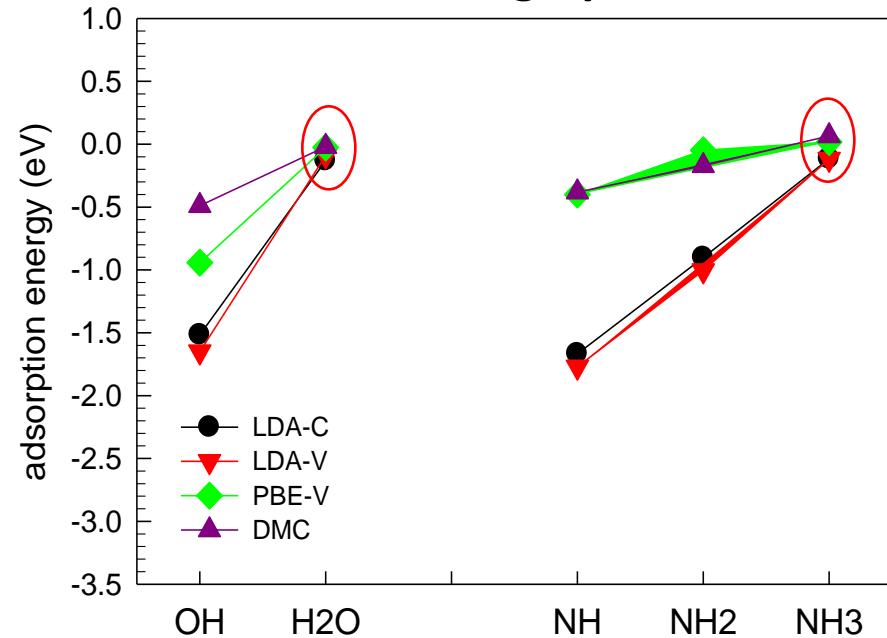
R. Liu et al., Applied Surface Science 254 (2008) 5706–5710

NH₃ and H₂O dehydrogenation:
• Adsorption structures
• Adsorption energies
• Reaction barriers
• Energy Profiles

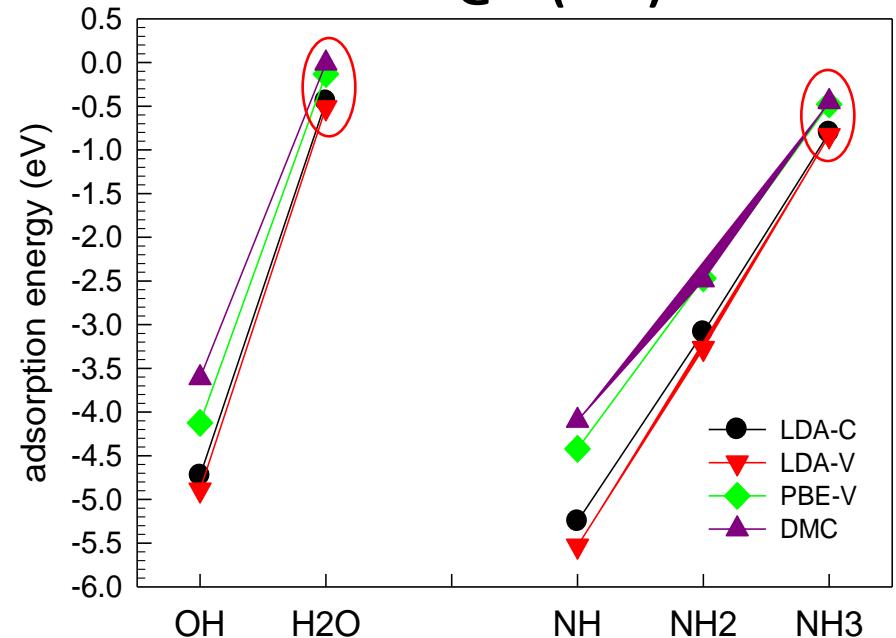
If DFT will give correct results?

Surface Adsorption

molecule@graphene

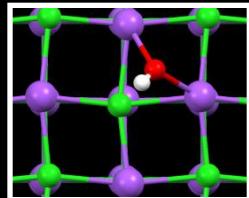


molecule@Al(100) surface

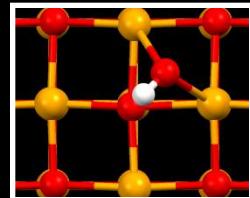


**For OH adsorption : LDA and GGA have predicted over binding effects. Now the question is that:
“Will this effect be observed on the other surfaces?”.**

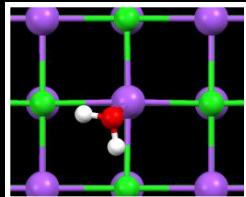
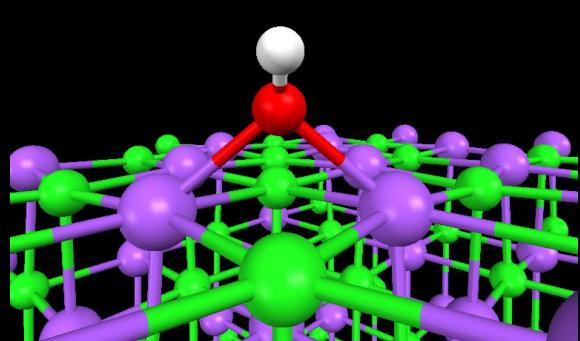
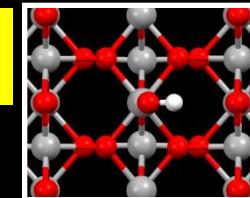
**OH on hollow site
(NaCl surface)**



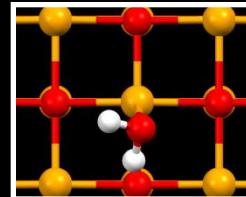
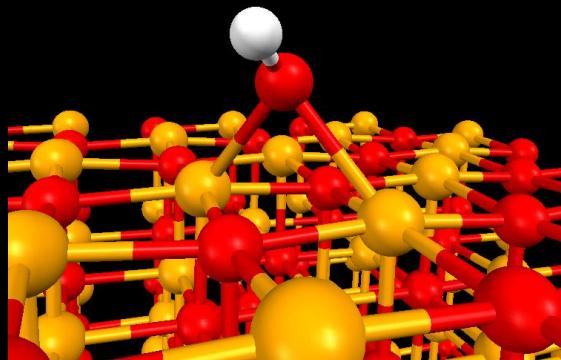
**OH on hollow site
(MgO surface)**



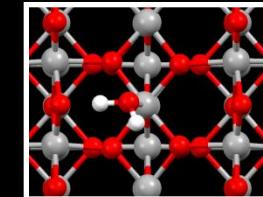
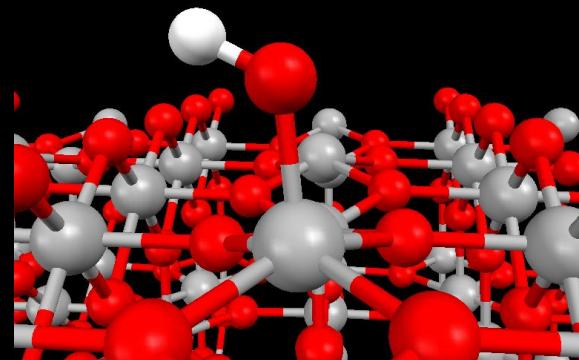
**OH on top site
(TiO₂ surface)**



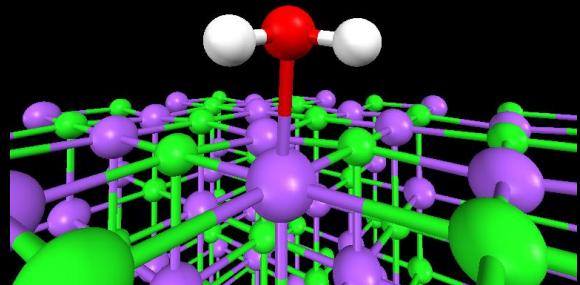
**H₂O on top site
(NaCl surface)**



**H₂O on top site
(MgO surface)**



**H₂O on top site
(TiO₂ surface)**



● Na atom

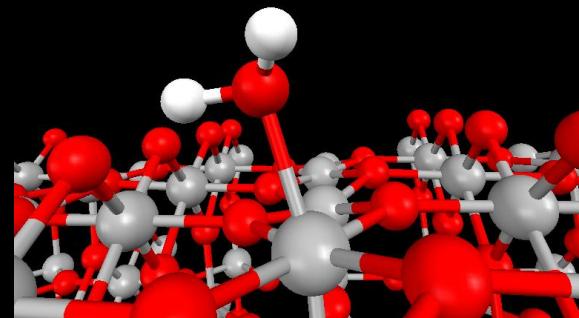
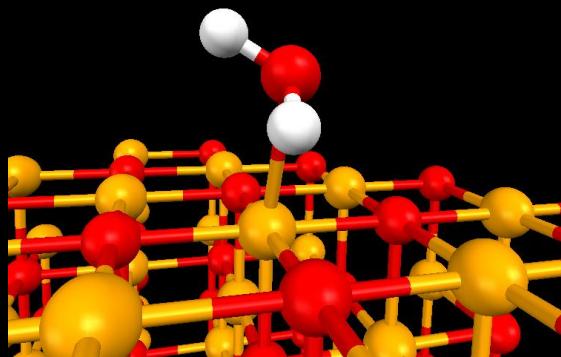
● Cl atom

● Mg atom

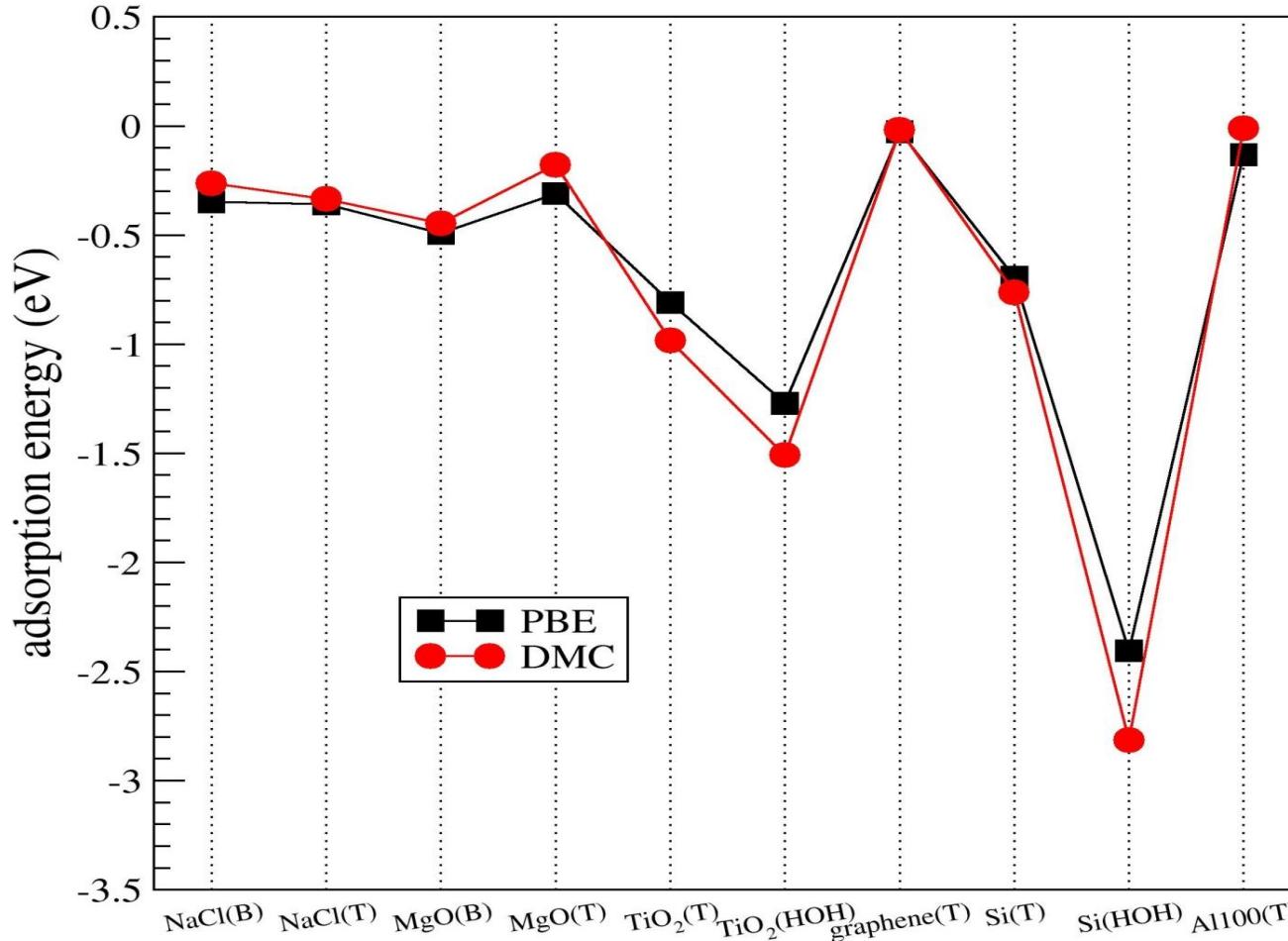
● O atom

● Ti atom

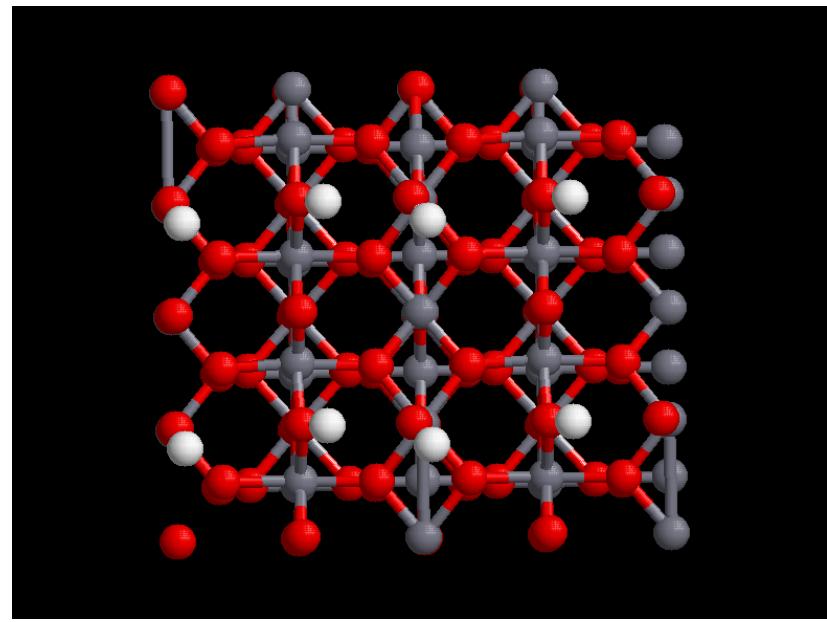
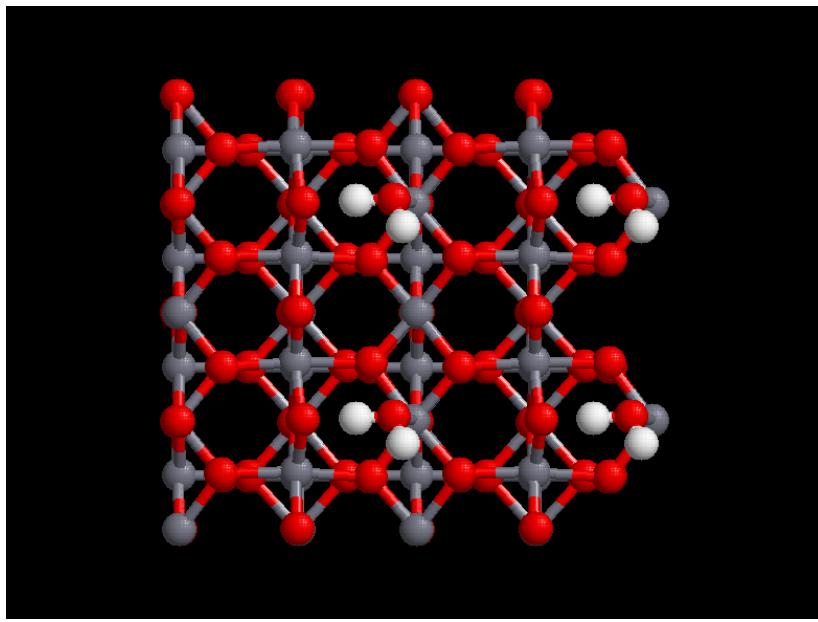
● H atom



Surface adsorption – H₂O



**For H₂O adsorption on NaCl, MgO, TiO₂, graphene, Si, Al surfaces,
GGA predicts an correct adsorption energy.**



PHYSICAL REVIEW B **86**, 045411 (2012)

Water does partially dissociate on the perfect TiO₂ (110) surface: A quantitative structure determination

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² Physik Department E20, Technische Universita "t Mu "nchen, James-Franck Strasse 1, Mu "nchen D-85748, Germany

(Received 23 January 2012; revised manuscript received 22 June 2012; published 9 July 2012)

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 - ✓ ***CO adsorption on late TM (111) surfaces***

The CO/Pt(111) Puzzle[†]

Times Cited: 285

Peter J. Feibelman,^{*,†} B. Hammer,[§] J. K. Nørskov,^{||} F. Wagner,[⊥] M. Scheffler,[⊥] R. Stumpf,[#] R. Watwe,[⊗] and J. Dumesic[⊗]

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TABLE 3: Binding Energy at fcc- Relative to Atop-Site for Low-Coverage CO/Pt(111)

supercell	θ (ML)	method	XC	ΔBE (eV)
$3 \times 2\sqrt{3}$	1/12	VASP, USP	PW91	0.25
2×2	1/4	Dacapo, USP	PW91	0.23
2×2	1/4	Dacapo, USP	PBE	0.24
2×2	1/4	Dacapo, USP	RPBE	0.16
2×2	1/4	Dacapo, USP	LDA	0.45
$c(4 \times 2)$	1/4	VASP, USP	LDA	0.41
$c(4 \times 2)$	1/4	Dacapo, USP	PW91	0.23
$c(4 \times 2)$	1/4	VASP, USP	PW91	0.18
$c(4 \times 2)$	1/4	VASP, PAW	PW91	0.13
$\sqrt{3} \times \sqrt{3}-R30^\circ$	1/3	Dacapo, USP	PW91	0.23
$\sqrt{3} \times \sqrt{3}-R30^\circ$	1/3	FP-LAPW	PW91	0.10

atomic conf. 4d 5s⁻ 4d 5s⁻ 4d⁺⁺ 4d⁺⁺ 5s⁻ 5d 6s⁻ 5d 6s⁻ 5d 6s⁻
 n_d 6.6 7.6 8.7 9.6 6.2 7.2 8.3

atomic conf. 4d 5s 4d 5s 4d 5s 4d 5s
 n_d 6.6 7.6 8.7 9.6 6.2 7.2 8.3

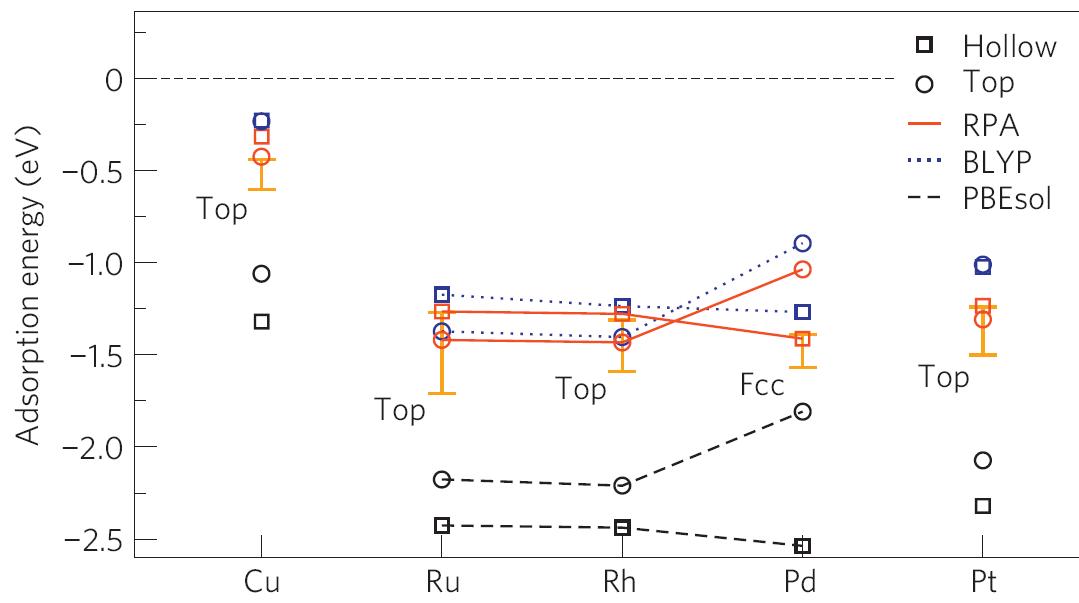
1. LDA & GGA results : FCC site
2. DFT with hybrid functionals :
- TOP site is slightly favor than FCC site ($\Delta E \sim 50$ meV)

Experimental result :
88% top site
12% bridge site

[ref] Blackman, G. S. et al. Phys. Rev. Lett. 1988, 61, 2352

Accurate surface and adsorption energies from many-body perturbation theory

L. Schimka¹*, J. Harl¹, A. Stroppa^{2†}, A. Grüneis¹, M. Marsman¹, F. Mittendorfer¹ and G. Kresse¹



site adsorption by 350 and 550 meV, respectively. The three most critical cases are Cu, Pt and Rh, where most DFT functionals predict the wrong site order. The RPA restores the correct site order in all cases: -0.42 eV (Cu top) < -0.32 (Cu face-centred cubic (fcc)), -1.31 eV (Pt top) < -1.23 (Pt fcc) and -1.43 eV (Rh top) < -1.28 (Rh hcp).

*Except on Pd(111),
CO adsorbs at Top
site, but LDA & PBE
predict wrong sites!*

Figure 3 | Surface energies, lattice constants and adsorption energies.

CO @ Pt & Au (111) surface - DMC

DMC input :

- 1. supercell : $2\sqrt{3} \times 2\sqrt{3}$ ($\theta(\text{ML})=1/3$)**
- 2. time step = 0.01**
- 3. number of moves = 30,000**

CO @ Pt(111) - 400 electrons

DMC result : atop site

Ead (fcc) = -0.73(6) eV

Ead (bri) = -1.18(6) eV

Ead (atop) = -1.57(6) eV

Exp. result : atop site ~ -1.5eV

CO @ Au(111) - 436 electrons

DMC result : atop site

Ead (fcc) = -0.23(7) eV

Ead (atop) = -0.43(8) eV

Exp. result : atop site ~ -0.4eV

*Diffusion Monte Carlo can predict
a correct adsorption site and adsorption energy.
But if there exists any simple reason for DFT
to predict a wrong adsorption site?*

Summary and Conclusion

1. Both LDA and GGA predict an overbinding effect for many “atom and molecule” adsorption on graphene and Al(100) surface.
2. DMC predicts the surface energy of C(100), Si(100), Ge(100), NaCl, MgO, CaO, TiO₂ such that $\Delta S(DMC) > \Delta S(LDA) > \Delta S(PBE)$.
3. DMC results indicate that for O an OH adsorption on Al(100), C(100), NaCl, MgO, TiO₂ surfaces, both LDA and GGA predict an overbinding effect; however, GGA predict a correct adsorption energy for H₂O.
4. DMC results indicate that for CO adsorption on late TM (111) surfaces, except for Top-site, DFT (LDA or GGA) predict over binding effect for all the other sites and thus led to wrong site prediction.

*It is about time
to do materials simulations
using Quantum Monte-Carlo*

Take home message:
Please be sure the
Exchange-Correlation
Approximation used
*is **correct** enough to give*
the reliable results



using Quantum Monte-Carlo