### Integrated Computational Materials Engineering Education

### Lecture on Density Functional Theory An Introduction

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## **Acknowledgements**

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# **Use of DFT in Materials Research**

### Table I. Tools Cited by Employers, Categorized and Ranked by the (Normalized) Frequency of Cites, along with Corresponding Results from the Computational Faculty Survey

Category	Example	Employer	<b>F</b> aculty⁺
Mechanics (mostly FEA)	DEFORM, ABAQUS	80%	14%
Thermodynamics (CALPHAD)	ThermoCalc, Pandat	53%	7%
Density Functional Theory	VASP, ABNIT	47%	21%
Programming Language/Integration	Matlab, Fortran, iSight	40%	43%
Casting	ProCAST, MAGMAsoft	40%	_
Molecular Dynamics/ Monte Carlo	LAMMPS	27%	14%
Fluid Flow/ Heat Transfer	COMSOL, Fluent	20%	7%
Diffusion/ Microstructural Evolution	DICTRA, PrecipiCalc, JMatPro	20%	_
Statistics	Informatics	13%	7%
Materials Modeling Suite	Materials Studio	13%	_
General Visualization	Mathematica, Tecplot	7%	29%
General Data Processing	Spreadsheet	7%	21%
Special Purpose	K-Flow, WARP 3D	7%	_
Materials Selection	CES Materials Selector	—	36%
Crystallography	CaRIne	—	7%

\*Some of the responses did not provide specific software/categories, and therefore we expect some degree of undercounting in this data.

K. Thornton, S. Nola, R. E. Garcia, MA and G. B. Olson, "Computational Materials Science and Engineering Education: A Survey of Trends and Needs," JOM (2009)

# The Role of Electronic Structure Methods in ICME

- A wide variety of relevant properties can be calculated from knowledge of atomic numbers alone
  - Elastic constants
  - Finite-temperature thermodynamic and transport properties
  - Energies of point, line and planar defects
- For many classes of systems accuracy is quite high
  - Can be used to obtain "missing" properties in materials design when experimental data is lacking, hard to obtain, or "controversial"
  - Can be used to discover new stable compounds with target properties
- The starting point for "hierarchical multiscale" modeling
  - Enables development of interatomic potentials for larger-scale classical modeling

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#### https://www.materialsproject.org/

A. Jain, S.P. Ong, G. Hautier, W. Chen, W.D. Richards, S. Dacek, S. Cholia, D. Gunter, D. Skinner, G. Ceder, K.A. Persson, *Applied Physics Letters Materials*, 2013, 1(1), 011002.

MATERIAL <b>TIAl</b>	ID: <b>mp-1953</b>	DOI: <b>10.17188/1194</b>	736 📥		Show Help Guides	
Electronic Structure	X-Ray Diffraction	X-Ray Absorption	Substrates Elasticit	y Similar Structures Calculation Summary Material Details	Provenance/Citation Lattice Parameters	
HM: P 1 a-2.824Å b-2.824Å c=4.065Å α=90.000° β=90.000°		Final Magnetic Moment 0.000 $\mu_B$	computed ICSD	computed ICSD		
		Magnetic Ordering Unknown	<ul> <li>a 2.824 Å</li> <li>b 2.824 Å</li> <li>β 90.000°</li> </ul>	a     2.829 Å     α     90.000°       b     2.829 Å     β     90.000°		
		Formation Energy / Atom -0.403 eV	с 4.065 Å (у 90.000° Volume <b>32.418</b> Å <sup>3</sup>	с 4.071 Å у 90.000° Volume <b>32.581</b> Å <sup>3</sup>		
			Energy Above Hull / Atom 0.000 eV	Final Structure Fractional Coordinates		
			Density 3.83 g/cm <sup>3</sup>	Al		
				Decomposes To Stable		
				Band Gap 0.000 eV	Ti	
Structure Type: Co	onventional Standa	ard Primitive R edra	efined CIF	Space Group	a b c 0.5 0.5 0.5	
Rotate alor	Zoom in/out	t Shift + Drag curs Option + Drag c	sor ursor	Hermann Mauguin P4/mmm [123] 0		

MATER <b>TIAl</b>	IIAL	ID: <b>mp-1953</b>	DOI: 10.1	7188/119	4736 📥		
Elasticit	<b>y</b>	and propor	rtion:				
Reference	for tenso	or and proper	rties:			l	Visualize with ELAIE
_		Stiffness Te	ensor Cij (	GPa)	_	Shear Modulus G <sub>V</sub>	Bulk Modulus K <sub>V</sub>
200	62	84	0	0	0	70 GF2	115 GPa
62	200	84	0	0	0	Shear Modulus G <sub>R</sub>	Bulk Modulus K <sub>R</sub>
84	84	174	0	0	0	63 GF2	115 GFa
0	0	0	112	0	0	Shear Modulus G <sub>VRH</sub>	Bulk Modulus K <sub>VRH</sub>
0	0	0	0	112	0	70 GPa	TIS GPa
0	0	0	0	0	41	Elastic Anisotropy	Poisson's Ratio
L_		Compliar	nce Tensor	Sij		0.98	0.25





0

50

100

150

х

-100

-50

0

50

100

MATERIAL <b>SiO<sub>2</sub></b>	ID: <b>mp-7000</b>	DOI: 10.17188/1272685		Guides					
Electronic Structure Provenance/Citation	Phonon Dispersion	on X-Ray Diffraction X-Ray Absorption Su	ubstrates Elasticity Piezoelectricity Simila	ar Structures C	alculation S	ummary			
EM:P 1		Material Details	Lattice Pa	Lattice Parameters					
a=5.022Å b=5.022Å c=5.511Å g=90.000°			Final Magnetic Moment $0.000 \ \mu_B$	computed	computed         ICSD           a         5.022 Å         α         90.000°           b         5.022 Å         β         90.000°		computed	ICSD	
γ=120.000°		Magnetic Ordering Unknown	a 5.022	a 4.914 Å b 4.914 Å			α 90.000° β 90.000°		
		Formation Energy / Atom -3.274 eV	c 5.51 Volume 1	c 5.511 Å y 120.000° Volume <b>120.336</b> Å <sup>3</sup>			c 5.407 Å (y 120.000° Volume 113.081 Å <sup>3</sup>		
		Energy Above Hull / Atom 0.011 eV	ull / Atom Final Structure Fractional Coordinates						
		Density 2.49 g/cm <sup>3</sup>		0					
		Decomposes To	a	b	C				
			0.1588	0.7439	0.4612				
				0.2561	0.4149	0.7945			
			Band Gap 5.719 eV	0.4149	0.2561	0.2055			
Structure Type:     Conventional Standard     Primitive     Refined       Space Filling		Space Group	0.5851	0.8412	0.1279				
			0.7439	0.1588	0.5388				
Zoom in/outShift + Drag cursorRotate along the center axisOption + Drag cursor	t Shift + Drag cursor	Hermann Mauguin			·				
	s Option + Drag cursor	P3 <sub>1</sub> 21 [152]		Si					



# Outline

- Formalism
  - Hydrogen Atom
  - Density Functional Theory
    - Exchange-Correlation Potentials
    - Pseudopotentials and Related Approaches
    - Some Commercial and Open Source Codes

### Practical Issues

- Implementation
  - Periodic boundary conditions
  - k-Points
  - Plane-wave basis sets
- Parameters controlling numerical precision
- Example Exercise

## Introduction

The Hydrogen Atom

Proton with mass  $M_1$ , coordinate  $R_1$ Electron with mass  $m_1$ , coordinate  $r_1$ 

$$\begin{pmatrix} -\frac{\hbar^2}{2M_1} \nabla_1^2 - \frac{\hbar^2}{2m_2} \nabla_2^2 - \frac{e^2}{r} \end{pmatrix} \Psi(R_1, r_2) = E \Psi(R_1, r_2)$$

$$r = r_1 - r_2, \quad R = \frac{M_1 R_1 + m_2 r_2}{M_1 + m_2}, \quad m = \frac{M_1 m_2}{M_1 + m_2}, \quad M = M_1 + m_2$$

$$\begin{pmatrix} -\frac{\hbar^2}{2M} \nabla_R^2 - \frac{\hbar^2}{2m} \nabla_r^2 - \frac{e^2}{r} \end{pmatrix} \Psi(R, r) = E \Psi(R, r)$$

$$\Psi(R, r) = \psi_{cm}(R) \psi_r(r)$$

$$\frac{\hbar^2}{2M} \nabla_R^2 \psi_{cm}(R) = E_{cm} \psi_{cm}(R) \qquad \left( -\frac{\hbar^2}{2m} \nabla_r^2 - \frac{e^2}{r} \right) \psi_r(r) = E_r \psi_r(r)$$

### **Hydrogen Atom**

Switch to Spherical Coordinates

$$-\frac{\hbar^2}{2m}\left(\frac{1}{r^2}\frac{\partial}{\partial r}\left(r^2\frac{\partial\psi}{\partial r}\right) + \frac{1}{r^2\sin\theta}\frac{\partial}{\partial\theta}\left(\sin\theta\frac{\partial\psi}{\partial\theta}\right) + \frac{1}{r^2\sin^2\theta}\frac{\partial^2\psi}{\partial\varphi^2}\right) - \frac{e^2}{r}\psi = E\psi$$

Z

$$\psi(r,\theta,\phi) = R_{nl}(r)Y_{l}^{m}(\theta,\phi)$$

$$-\frac{\hbar^{2}}{2m} \left(\frac{1}{r^{2}} \frac{d}{dr} \left(r^{2} \frac{d}{dr}\right) - \frac{l(l+1)}{r^{2}} - \frac{e^{2}}{r}\right) R_{nl}(r) = E_{n}R_{nl}(r)$$

$$E_{n} = -\frac{me^{4}}{2\hbar^{2}} \frac{1}{n^{2}} = -\frac{13.6}{n^{2}} eV$$

# **Hydrogen Atom**

Wavefunctions



http://galileo.phys.virginia.edu/classes/751.mf1i.fall02/HydrogenAtom.htm



Probability densities through the xz-plane for the electron at different quantum numbers (I, across top; n, down side; m = 0)

http://en.wikipedia.org/wiki/Hydrogen\_atom

# **The Many-Electron Problem**

- Collection of
  - Nions
  - *n* electrons
- Analytical solution like that for hydrogen atom not available



## **Born-Oppenheimer Approximation**

- Mass of nuclei exceeds that of the electrons by a factor of 1000 or more
  - we can neglect the kinetic energy of the nuclei
  - treat the ion-ion interaction classically
  - significantly simplifies the Hamiltonian for the electrons
- Consider Hamiltonian for *n* electrons in potential of *N* nuclei with atomic numbers Z<sub>i</sub>

$$H = -\frac{\hbar^2}{2m} \sum_{i=1}^n \nabla_{\mathbf{r}_i}^2 - \sum_{i=1}^N \sum_{j=1}^n \frac{Z_i e^2}{|\mathbf{R}_i - \mathbf{r}_j|} + \frac{1}{2} \sum_{i=1}^n \sum_{\substack{j=1\\i\neq j}}^n \frac{e^2}{|\mathbf{r}_i - \mathbf{r}_j|}$$
  
external potential  
$$\equiv V_{\text{ext}}(\mathbf{r}_j)$$

## **Density Functional Theory**

Hohenberg and Kohn (1964), Kohn and Sham (1965)

- For each external potential there is a unique groundstate electron density
- Energy can be obtained by minimizing of a *density functional with respect to density of electrons n(r)*

$$E_{\text{tot}}[n(\mathbf{r})] = T[n(\mathbf{r})] + E_{\text{int}}[n(\mathbf{r})] + \int d\mathbf{r} V_{\text{ext}}(\mathbf{r})n(\mathbf{r}) + E_{\text{ion-ion}}$$
  
Kinetic Energy Electron-Electron Electron-Ion Interactions

### Kohn-Sham Approach

$$n(r) = -e\sum_{i=1}^{n} \left|\phi_i(r)\right|^2$$

$$E[\{\phi_i\}] = -\frac{\hbar^2}{2m} \sum_{i=1}^n \int \phi_i^* \nabla_i^2 \phi_i d^3 r + \int V_{ext}(r) n(r) d^3 r + \frac{1}{2} \int \frac{n(r)n(r')}{|r-r'|} d^3 r d^3 r' + E_{xc}[n(r)]$$

Many-Body Electron-Electron Interactions Lumped into  $E_{xc}[n(r)]$ 

"Exchange-Correlation Energy"

### **Kohn-Sham Equations**

$$\left[-\frac{\hbar^2}{2m}\nabla_i^2 + V_{nuclei}(r) + \int \frac{n(r')}{|r-r'|} d^3r' + V_{xc}(r)\right]\phi_i(r) = \varepsilon_i\phi_i(r)$$

$$V_{xc}(r) = \frac{\delta E_{xc}[n(r)]}{\delta n(r)}$$

### **Local Density Approximation**

(e.g., J. P. Perdew and A. Zunger, Phys. Rev. B 23, 5048 (1981))

$$E_{xc}[n(r)] = \int \varepsilon_{xc}^{\text{hom}}(n(r))n(r)d^3r$$

 $\varepsilon_{xc}^{\text{hom}}(n(r)) \rightarrow \text{Exchange} - \text{Correlation Energy of Homogeneous}$ Electron Gas of Density n(r)

### **Generalized Gradient Approximation**

J. P. Perdew, K. Burke and M. Ernzerhof, Phys. Rev. Lett. 77 (1996)

$$E_{xc}^{GGA}[n(r)] = \int \varepsilon_x^{\text{hom}}(n(r))n(r)F_{xc}(r_s,\zeta,s)d^3r$$

$$n = 3 / 4\pi r_s^3 = k_F^3 / 3\pi^2$$

$$\zeta = (n_{\uparrow} - n_{\downarrow}) / n$$

 $s = |\nabla n|/2k_F n$ 



# A Note on Accuracy and Ongoing Research

- LDA often leads to "overbinding"
  - Lattice constants can be 1-3 % too small, elastic constants 10-15 % too stiff, cohesive energies 5-20 % too large
- BUT, errors are largely systematic
  - Energy differences tend to be more accurate
- GGA corrects for overbinding
  - Sometimes "overcorrects"
- "Beyond DFT" Approaches
  - For "highly correlated" systems LDA & GGA perform worse and corrections required (DFT+U, Hybrid Hartree-Fock/DFT, Meta-GGA, DMFT, …)
  - Non-bonded interactions, e.g., van der Waals interactions in graphite, require additional terms or functionals (e.g., vdW-DF)

# **Pseudopotentials**

- Potential due to ions is singular at ion core
- Eigenfunctions oscillate rapidly near singularity
- Eigenfunction in bonding region is smooth



# **Pseudopotentials**

ψ

V(r)

<sub>pseudo</sub>(r)

- For plane-wave basis sets, rapid oscillations require large number of basis functions
  - expensive
  - unnecessary
    - these oscillations don't alter bonding properties
- Replace potential with nonsingular potential
  - preserve bonding tails of eigenfunction
  - preserve distribution of charge between core and tail regions
  - reduces number of plane waves required for accurate expansion of wavefunction
- Transferable
  - developed from properties of isolated atoms
  - applied in other situations

# **Summary of Approaches**

### Pseudopotentials

- Core electrons removed from problem and enter only in their effect of the pseudopotential felt by the valence electrons
- Kohn-Sham equations solved for valence electrons only
- "Augment" Plane Waves with atomic-like orbitals
  - An efficient basis set that allows all electrons to be treated in the calculations
  - Basis for "all-electron" codes
- Projector-Augmented-Wave method
  - Combines features of both methods
  - Generally accepted as the basis for the most accurate approach for calculations requiring consideration of valence electrons only

# Some of the Widely Used Codes

- VASP (http://cms.mpi.univie.ac.at/vasp/)
  - Commercial, Plane-Wave Basis, Pseudopotentials and PAW
- **PWSCF** (http://www.quantum-espresso.org/)
  - Free (and available to run on nanohub), Plane-Wave Basis, Pseudopotentials and PAW
- CASTEP (http://ccpforge.cse.rl.ac.uk/gf/project/castep/)
  - Free in UK, licensed by Accelrys elsewhere, Plane-Wave Basis, Pseudopotentials
- ABINIT (http://www.abinit.org/)
  - Free (and available to run on nanohub), plane-wave basis, pseudopotentials and PAW
- WIEN2K (http://www.wien2k.at/)
  - Commercial (modest license fee), all-electron augmented wave method

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• Example Exercise

## **Total Energy in Density Functional Theory**

$$E[\{\phi_i\}] = -\frac{\hbar^2}{2m_e} \sum_{i=1}^{N_e} \int \phi_i^* \nabla_i^2 \phi_i d^3 r + \int V_{ext}(r) n(r) d^3 r + \frac{1}{2} \int \frac{n(r)n(r')}{|r-r'|} d^3 r d^3 r' + E_{xc}[n(r)]$$
  
Electron Density  $n(r) = -e \sum_{i=1}^n |\phi_i(r)|^2$ 

Electron Wavefunctions  $\phi_i(r)$ 

Potential Electrons Feel from Nuclei  $V_{ext}(r)$ 

Exchange-Correlation Energy  $E_{xc}[n(r)]$ 

Form depends on whether you use LDA or GGA

### **Kohn-Sham Equations**

Schrödinger Equation for Electron Wavefunctions

$$\left[-\frac{\hbar^2}{2m_e}\nabla_i^2 + V_{ext}(r) + \int \frac{n(r')}{|r-r'|} d^3r' + V_{xc}(r)\right]\phi_i(r) = \varepsilon_i\phi_i(r)$$

Exchange-Correlation Potential 
$$V_{xc}(r) = \frac{\delta E_{xc}[n(r)]}{\delta n(r)}$$

Electron Density 
$$n(r) = -e \sum_{i=1}^{n} |\phi_i(r)|^2$$

**Note:**  $\phi_i$  depends on n(r) which depends on  $\phi_i \rightarrow$ Solution of Kohn-Sham equations must be done iteratively

# **Self-Consistent Solution to DFT Equations**



- 1. Set up atom positions
- 2. Make initial guess of "input" charge density (often overlapping atomic charge densities)
- 3. Solve Kohn-Sham equations with this input charge density
- 4. Compute "output" charge density from resulting wavefunctions
- 5. If energy from input and output densities differ by amount greater than a chosen threshold, mix output and input density and go to step 2
- Quit when energy from input and output densities agree to within prescribed tolerance (e.g., 10<sup>-5</sup> eV)

**Note**: In your exercise, positions of atoms are dictated by symmetry. If this is not the case another loop must be added to minimize energy with respect to atomic positions.

# **Implementation of DFT for a Single Crystal**

Crystal Structure Defined by Unit Cell Vectors and Positions of Basis Atoms

Example: Diamond Cubic Structure of Si



Unit Cell Vectors  $a_1 = a (-1/2, 1/2, 0)$   $a_2 = a (-1/2, 0, 1/2)$  $a_3 = a (0, 1/2, 1/2)$ 

Basis Atom Positions 0 0 0 1⁄4 1⁄4 1⁄4

All atoms in the crystal can be obtained by adding integer multiples of unit cell vectors to basis atom positions

### **Electron Density in Crystal Lattice**



Unit-Cell Vectors  $a_1 = a (-1/2, 1/2, 0)$   $a_2 = a (-1/2, 0, 1/2)$  $a_3 = a (0, 1/2, 1/2)$ 

Electron density is periodic with periodicity given by  $\mathbf{R}_{uvw}$ 

$$n(\mathbf{r}) = n(\mathbf{r} + \mathbf{R}_{uvw})$$

Translation Vectors:  $\mathbf{R}_{uvw} = u\mathbf{a}_1 + v\mathbf{a}_2 + w\mathbf{a}_3$ 

## **Electronic Bandstructure**

Example for Si



http://de.wikipedia.org/wiki/Datei:Band\_structure\_Si\_schematic.svg

Electronic wavefunctions in a crystal can be indexed by point in reciprocal space (**k**) and a band index ( $\beta$ )

### Why?

Wavefunctions in a Crystal Obey Bloch's Theorem

For a given band  $\beta$ 

$$\phi_{\mathbf{k}}^{\beta}(\mathbf{r}) = \exp(i\mathbf{k}\cdot\mathbf{r})\,u_{\mathbf{k}}^{\beta}(\mathbf{r})$$

Where  $u_{\mathbf{k}}^{\beta}(\mathbf{r})$  is periodic in real space:  $u_{\mathbf{k}}^{\beta}(\mathbf{r}) = u_{\mathbf{k}}^{\beta}(\mathbf{r} + \mathbf{R}_{uvw})$ 

Translation Vectors:  $\mathbf{R}_{uvw} = u\mathbf{a}_1 + v\mathbf{a}_2 + w\mathbf{a}_3$ 

### **Representation of Electron Density**

$$\phi_{\mathbf{k}}^{\beta}(\mathbf{r}) = \exp(i\mathbf{k}\cdot\mathbf{r}) \, u_{\mathbf{k}}^{\beta}(\mathbf{r})$$

$$n(\mathbf{r}) = -e \sum_{i=1}^{N_e} \left| \phi_i(\mathbf{r}) \right|^2 \longrightarrow n(\mathbf{r}) = -e \sum_{\beta} \int_{\Omega_{BZ}} \left| \phi_k^{\beta}(\mathbf{r}) \right|^2 f(\varepsilon_k^{\beta} - \varepsilon_F) \frac{d^3 k}{\Omega_{BZ}}$$

Integral over k-points in first Brillouin zone  $f(\varepsilon - \varepsilon_F)$  is Fermi-Dirac distribution function with Fermi energy  $\varepsilon_F$ 

In practice the integral over the Brillouin zone is replaced with a sum over a finite number of k-points ( $N_{kpt}$ )

$$n(\mathbf{r}) \approx -e \sum_{\beta} \sum_{j=1}^{N_{kpt}} w_j \left| \phi_{\mathbf{k}_j}^{\beta} \left( \mathbf{r} \right) \right|^2 f(\varepsilon_{\mathbf{k}_j}^{\beta} - \varepsilon_F)$$

### One parameter that needs to be checked for numerical convergence is number of k-points

### **Representation of Wavefunctions**

Fourier-Expansion as Series of Plane Waves

For a given band: 
$$\phi_{\mathbf{k}}^{\beta}(\mathbf{r}) = \exp(i\mathbf{k}\cdot\mathbf{r}) u_{\mathbf{k}}^{\beta}(\mathbf{r})$$

Recall that  $u_{\mathbf{k}}^{\beta}(\mathbf{r})$  is periodic in real space:  $u_{\mathbf{k}}^{\beta}(\mathbf{r}) = u_{\mathbf{k}}^{\beta}(\mathbf{r} + \mathbf{R}_{uvw})$ 

 $u_{\mathbf{k}}^{\beta}(\mathbf{r})$  can be written as a Fourier Series:

$$u_{\mathbf{k}}^{\beta}(\mathbf{r}) = \sum_{lmn} u_{\mathbf{k}}^{\beta}(\mathbf{G}_{lmn}) \exp(i\mathbf{G}_{lmn} \cdot \mathbf{r})$$

$$\mathbf{G}_{lmn} = l\mathbf{a}_1^* + m\mathbf{a}_2^* + n\mathbf{a}_3^*$$

where the  $\mathbf{a}_{i}^{*}$  are primitive *reciprocal lattice vectors* 

$$\mathbf{a}_{1}^{*} \cdot \mathbf{a}_{1} = 2\pi \qquad \mathbf{a}_{1}^{*} \cdot \mathbf{a}_{2} = 0 \qquad \mathbf{a}_{1}^{*} \cdot \mathbf{a}_{3} = 0$$
$$\mathbf{a}_{2}^{*} \cdot \mathbf{a}_{1} = 0 \qquad \mathbf{a}_{2}^{*} \cdot \mathbf{a}_{2} = 2\pi \qquad \mathbf{a}_{2}^{*} \cdot \mathbf{a}_{3} = 0$$
$$\mathbf{a}_{3}^{*} \cdot \mathbf{a}_{1} = 0 \qquad \mathbf{a}_{3}^{*} \cdot \mathbf{a}_{2} = 0 \qquad \mathbf{a}_{3}^{*} \cdot \mathbf{a}_{3} = 2\pi$$

## **Recall Properties of Fourier Series**



Black line = (exact) triangular wave

Colored lines = Fourier series truncated at different orders

http://mathworld.wolfram.com/FourierSeriesTriangleWave.html

General Form of Fourier Series:  $f(x) = \frac{1}{2}a_0 + \sum_{n=1}^{\infty} a_n \cos(nx) + \sum_{n=1}^{\infty} b_n \sin(nx)$ 

For Triangular Wave: 
$$f(x) = \frac{8}{\pi^2} \sum_{n=1,3,5,...}^{\infty} \frac{(-1)^{(n-1)/2}}{n^2} \sin\left(\frac{n\pi x}{L}\right).$$

Typically we expect the accuracy of a truncated Fourier series to improve as we increase the number of terms

### **Representation of Wavefunctions**

Plane-Wave Basis Set

For a given band  $\phi_{\mathbf{k}}^{\beta}(\mathbf{r}) = \exp(i\mathbf{k}\cdot\mathbf{r}) u_{\mathbf{k}}^{\beta}(\mathbf{r})$ 

Use Fourier Expansion

$$\phi_{\mathbf{k}}^{\beta}(\mathbf{r}) = \sum_{\mathbf{G}} u_{\mathbf{k}}^{\beta}(\mathbf{G}) \exp\left[i(\mathbf{G} + \mathbf{k}) \cdot \mathbf{r}\right]$$

In practice the Fourier series is truncated to include all **G** for which:  $\frac{\hbar^2}{2m} (\mathbf{G} + \mathbf{k})^2 < E_{\text{cut}}$ 

### Another parameter that needs to be checked for convergence is the "plane-wave cutoff energy" E<sub>cut</sub>

### **Examples of Convergence Checks**



http://www.fhi-berlin.mpg.de/th/Meetings/FHImd2001/pehlke1.pdf

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### Example Exercise

# Your Exercise: Part 1

- Calculate equation of state of diamond cubic Si using Quantum Espresso on Nanohub (<u>http://nanohub.org/</u>)
- You will compare accuracy of LDA and GGA
- You will check numerical convergence with respect to number of k-points and plane-wave cutoff
- You will make use of the following unit cell for diamond-cubic structure



Lattice Vectors  $a_1 = a (-1/2, 1/2, 0)$   $a_2 = a (-1/2, 0, 1/2)$  $a_3 = a (0, 1/2, 1/2)$ 

*Basis Atom Positions* 0 0 0 1/4 1/4 1/4

### **Equation of State**

A Probe of Interatomic Interactions



Volume per atom (=a<sup>3</sup>/8 for Si)

Diamond Cubic Structure of Si



http://www.e6cvd.com/cvd/page.jsp? pageid=361

### **Equation of State**

What Properties Can we Learn from It?

Pressure versus Volume Relation

 $P = -\frac{\partial E}{\partial V}$  Given E(V) one can compute P(V) by taking derivative

Recall  $1^{st}$  Law of Thermo: dE = T dS - P dV and consider T = 0 K

### Equilibrium Volume (or Lattice Constant)

Volume corresponding to zero pressure = Volume where slope of E(V) is zero  $\approx$  Volume measured experimentally at P = 1 atm

### **Bulk Modulus**

$$B = -V\frac{\partial P}{\partial V} = V\frac{\partial^2 E}{\partial V^2}$$

B related to curvature of E(V) Function

## Your Exercise: Part 2

Non-hydrostatic Stress and Strain

Stress-Strain Relations in Linear Elasticity



### Stress-Strain Relations in Linear Elasticity

Consider Single Strain  $\varepsilon_{33} = \varepsilon$   $\sigma_{33} = C_{11}\varepsilon$  $\sigma_{22} = C_{12}\varepsilon$ 

Voigt Notation (for Cubic Crystal)  $C_{3333} = C_{2222} = C_{1111} = C_{11}$  $C_{2233} = C_{1133} = C_{1122} = C_{2211} = C_{3311} = C_{3322} = C_{12}$