

1.021, 3.021, 10.333, 22.00 : Introduction to Modeling and Simulation : Spring 2012

Part II – Quantum Mechanical Methods : Lecture 9

Some Review & Introduction to Solar PV

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Part II Topics

1. It's a Quantum World: The Theory of Quantum Mechanics
2. Quantum Mechanics: Practice Makes Perfect
3. From Many-Body to Single-Particle; Quantum Modeling of Molecules
4. Application of Quantum Modeling of Molecules: Solar Thermal Fuels
5. Application of Quantum Modeling of Molecules: Hydrogen Storage
6. From Atoms to Solids
7. Quantum Modeling of Solids: Basic Properties
8. Advanced Prop. of Materials: What else can we do?
9. Application of Quantum Modeling of Solids: Solar Cells Part I
10. Application of Quantum Modeling of Solids: Solar Cells Part II
11. Application of Quantum Modeling of Solids: Nanotechnology

Lesson outline

- Discussion of PSET
- Review for the Quiz
- Introduction to Solar PV

Motivation: ab-initio modeling!

?
electrical
properties



?
mechanical
properties

?
optical
properties

Vision without Action is a *Dream*

Action without Vision is a *Nightmare*

Japanese proverb

Why quantum mechanics?

Problems in **classical** physics that led to **quantum** mechanics:

- “classical atom”
- quantization of properties
- wave aspect of matter
- (black-body radiation), ...

Wave aspect of matter

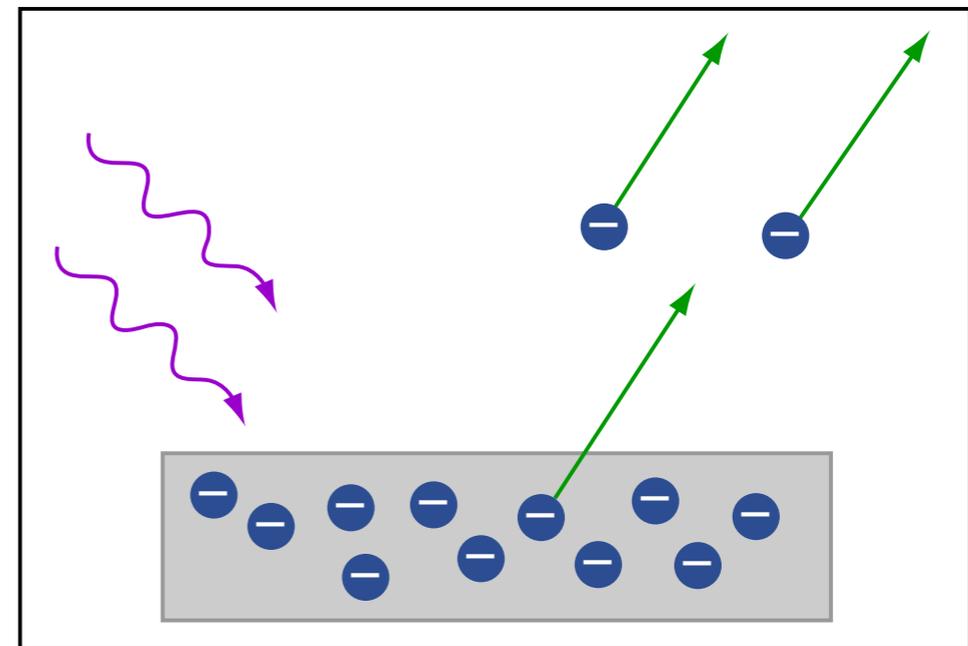
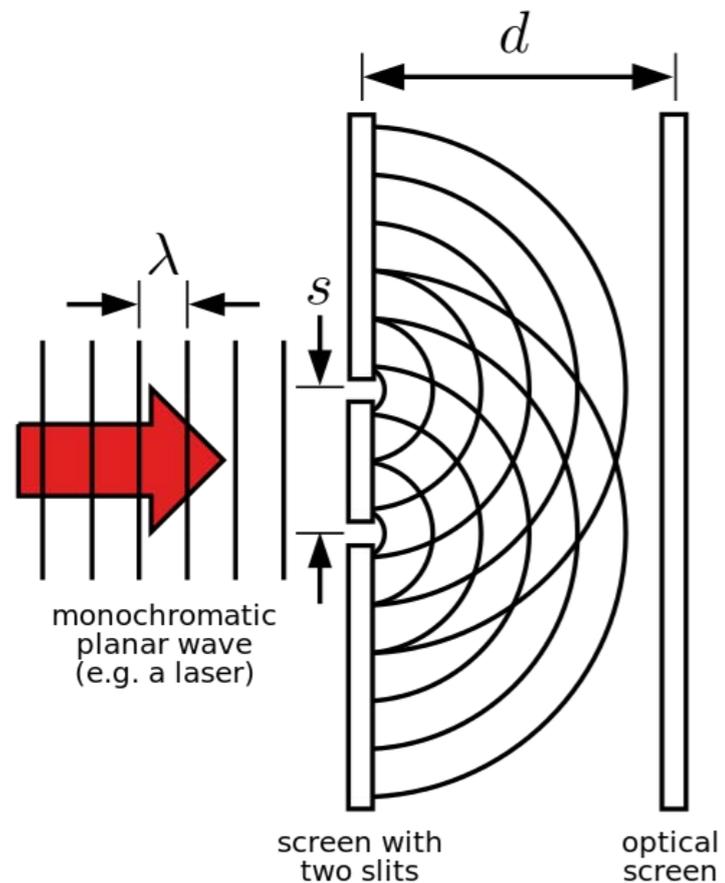
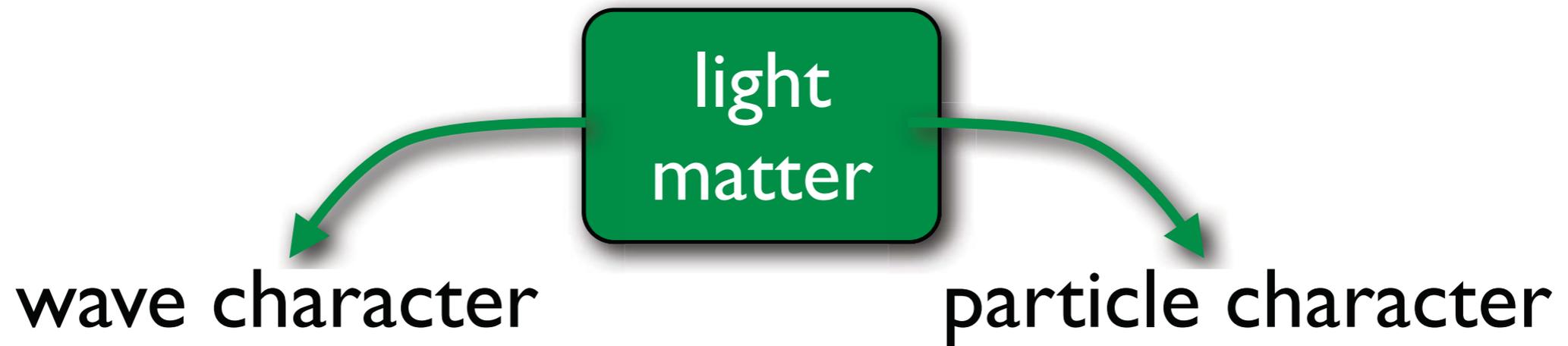
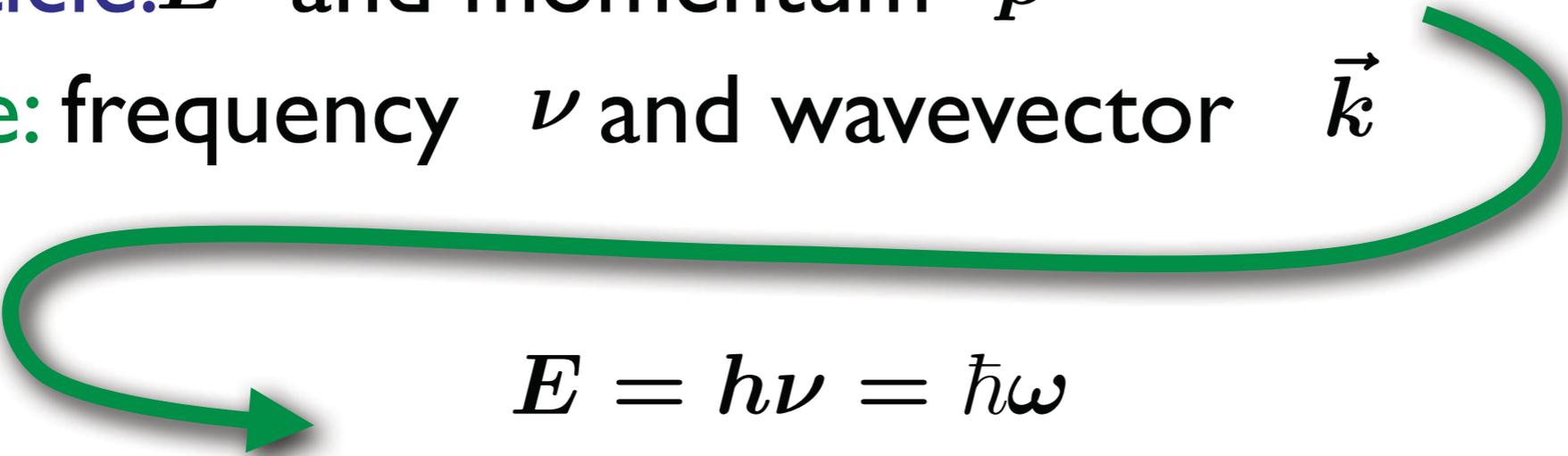


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Wave aspect of matter

particle: E and momentum \vec{p}

wave: frequency ν and wavevector \vec{k}


$$E = h\nu = \hbar\omega$$

$$\vec{p} = \hbar\vec{k} = \frac{h}{\lambda} \frac{\vec{k}}{|\vec{k}|}$$

de Broglie: free particle can be described as a
planewave
with

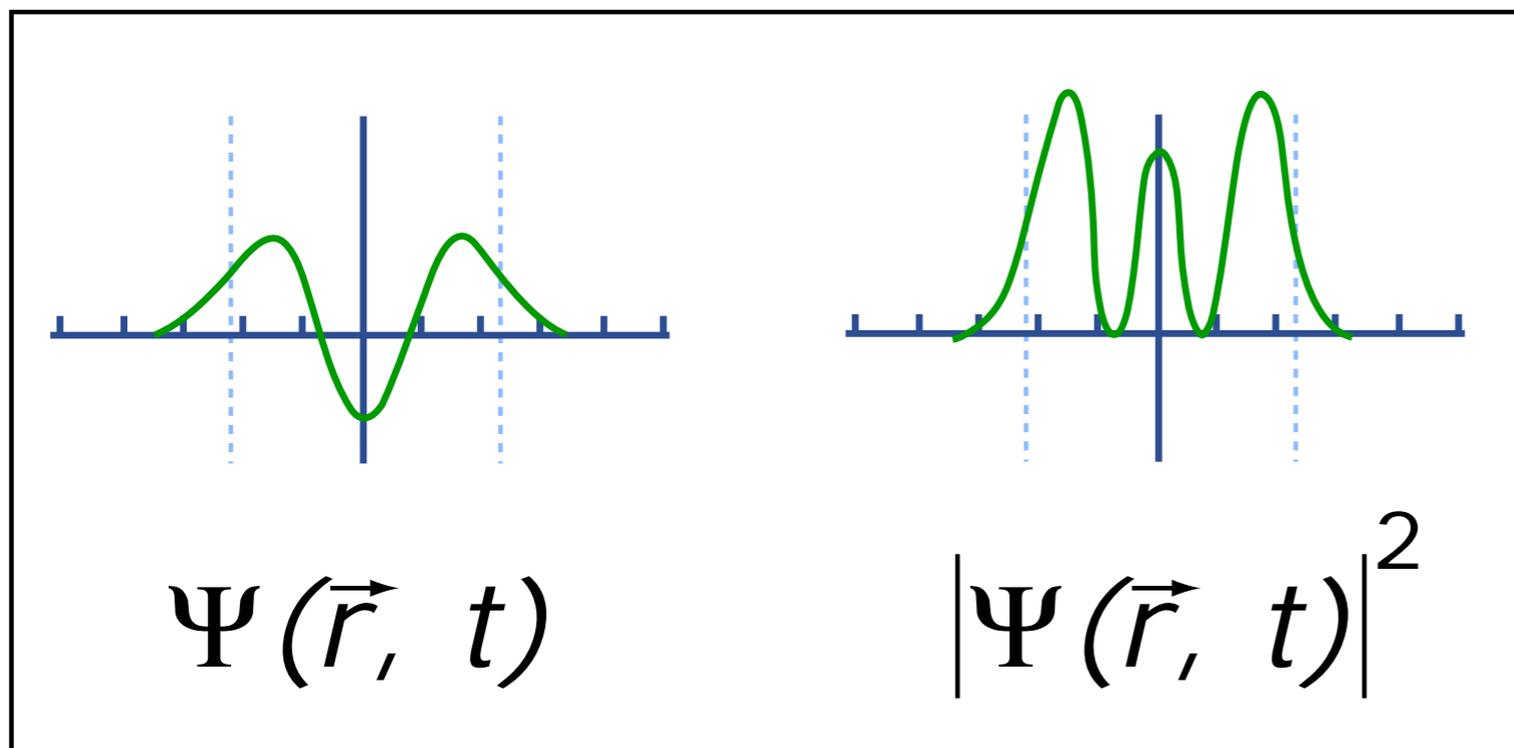
$$\psi(\vec{r}, t) = A e^{i(\vec{k} \cdot \vec{r} - \omega t)}$$

$$\lambda = \frac{h}{mv}$$

Interpretation of a wavefunction

$\psi(\vec{r}, t)$ → wave function (complex)

$|\psi|^2 = \psi\psi^*$ → interpretation as probability to find particle!



$$\int_{-\infty}^{\infty} \psi\psi^* dV = 1$$

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Schrödinger equation

H time independent: $\psi(\vec{r}, t) = \psi(\vec{r}) \cdot f(t)$

$$i\hbar \frac{\dot{f}(t)}{f(t)} = \frac{H\psi(\vec{r})}{\psi(\vec{r})} = \text{const.} = E$$

$$H\psi(\vec{r}) = E\psi(\vec{r})$$

$$\psi(\vec{r}, t) = \psi(\vec{r}) \cdot e^{-\frac{i}{\hbar}Et}$$

time independent Schrödinger equation
stationary Schrödinger equation

The hydrogen atom

stationary

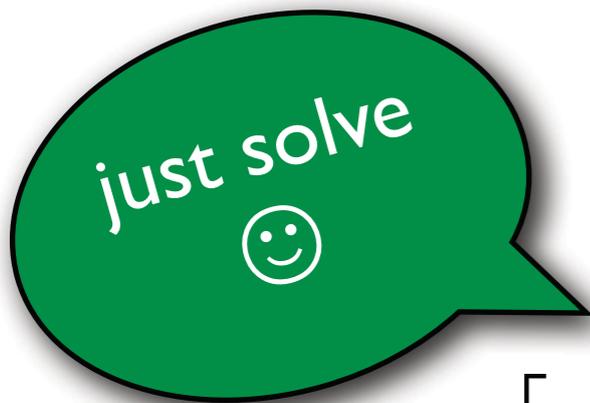
Schrödinger equation

$$H\psi = E\psi$$

$$[T + V]\psi = E\psi$$

$$\left[-\frac{\hbar^2}{2m}\nabla^2 + V \right] \psi(\vec{r}) = E\psi(\vec{r})$$

$$\left[-\frac{\hbar^2}{2m}\nabla^2 - \frac{e^2}{4\pi\epsilon_0 r} \right] \psi(\vec{r}) = E\psi(\vec{r})$$



The hydrogen atom

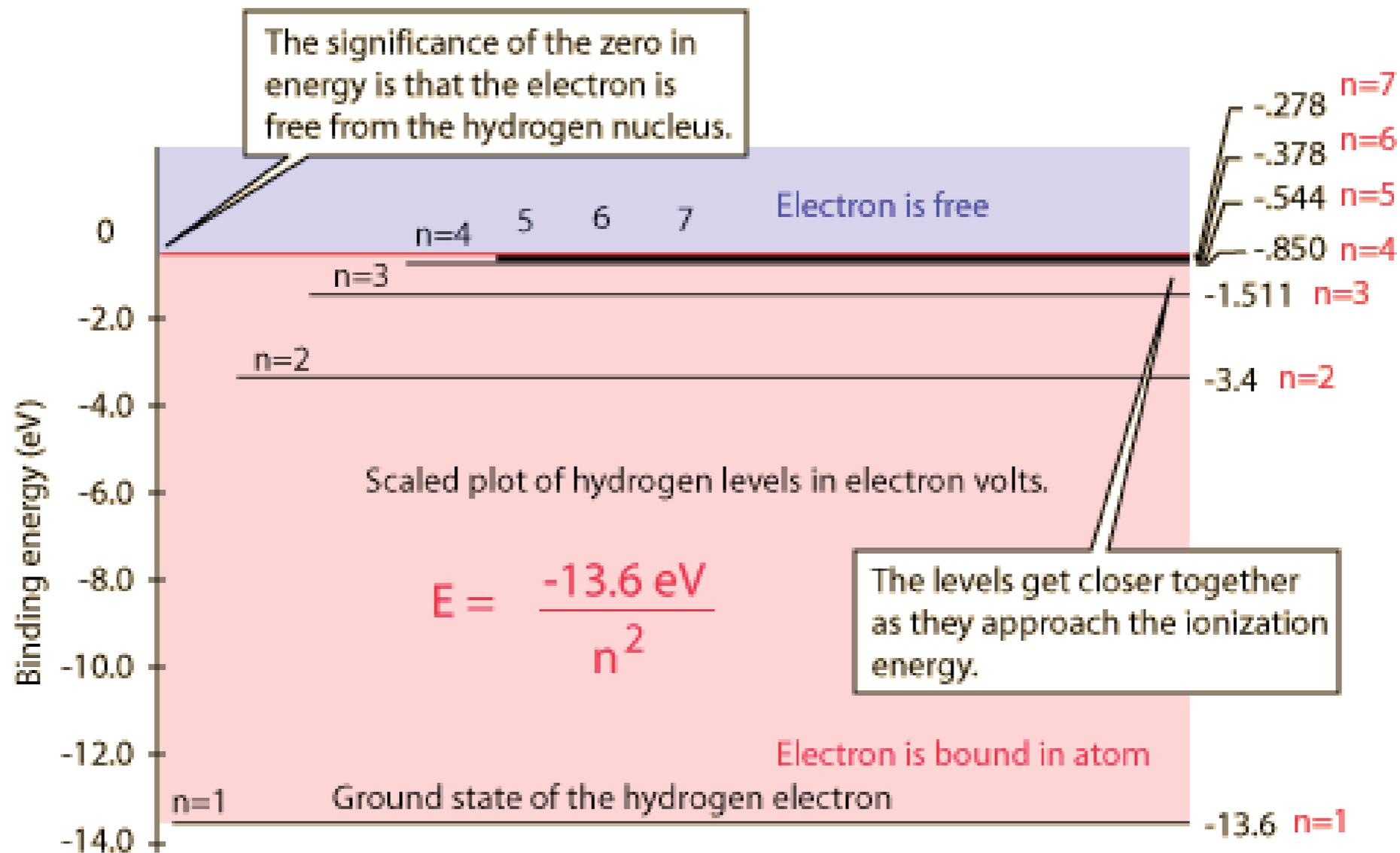
quantum numbers

n	l	m_l	$F(\phi)$	$P(\theta)$	$R(r)$
1	0	0	$\frac{1}{\sqrt{2\pi}}$	$\frac{1}{\sqrt{2}}$	$\frac{2}{a_0^{3/2}} e^{-r/a_0}$
2	0	0	$\frac{1}{\sqrt{2\pi}}$	$\frac{1}{\sqrt{2}}$	$\frac{1}{2\sqrt{2}a_0^{3/2}} \left[2 - \frac{r}{a_0} \right] e^{-r/2a_0}$
2	1	0	$\frac{1}{\sqrt{2\pi}}$	$\frac{\sqrt{6}}{2} \cos \theta$	$\frac{1}{2\sqrt{6}a_0^{3/2}} \frac{r}{a_0} e^{-r/2a_0}$
2	1	± 1	$\frac{1}{\sqrt{2\pi}} e^{\pm i\phi}$	$\frac{\sqrt{3}}{2} \sin \theta$	$\frac{1}{2\sqrt{6}a_0^{3/2}} \frac{r}{a_0} e^{-r/2a_0}$

Image by MIT OpenCourseWare.

The hydrogen atom

Energies:
$$E_n = \frac{-me^4}{8\epsilon_0^2 h^2} \frac{1}{n^2} = \frac{-13.6 \text{ eV}}{n^2} \quad n = 1, 2, 3, \dots$$



Atomic units

$$1 \text{ eV} = 1.6021765 \cdot 10^{-19} \text{ J}$$

$$1 \text{ Rydberg} = 13.605692 \text{ eV} = 2.1798719 \cdot 10^{-18} \text{ J}$$

$$1 \text{ Hartree} = 2 \text{ Rydberg}$$

$$1 \text{ Bohr} = 5.2917721 \cdot 10^{-11} \text{ m}$$

Atomic units (a.u.):

Energies in Ry
Distances in Bohr

Also in use: $1 \text{ \AA} = 10^{-10} \text{ m}$, $\text{nm} = 10^{-9} \text{ m}$

Everything is spinning ...

Stern–Gerlach experiment (1922)

$$\begin{aligned}\vec{F} &= -\nabla E \\ &= \nabla \vec{m} \cdot \vec{B}\end{aligned}$$

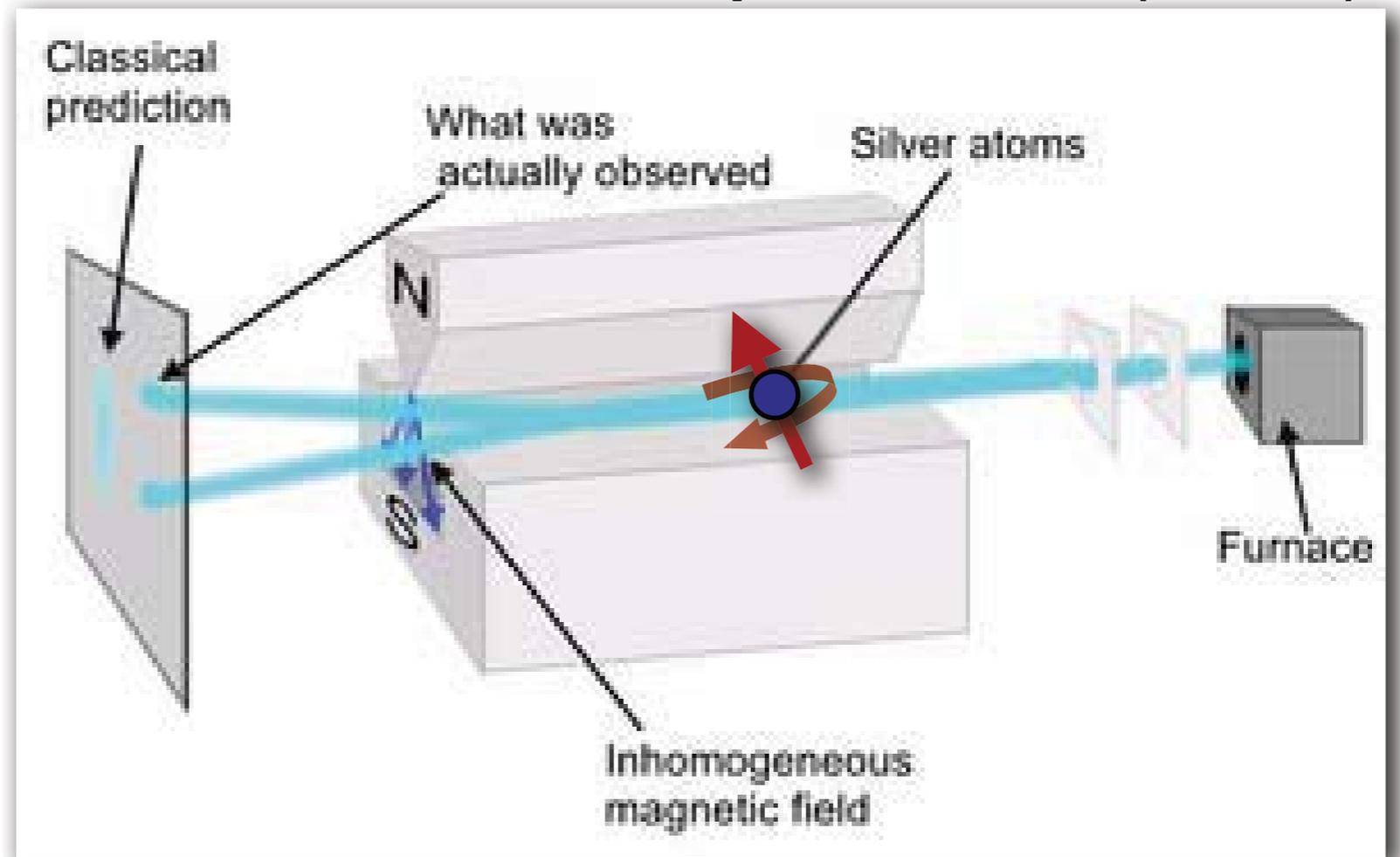
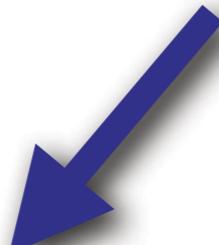


Image courtesy of Teresa Knott.

Everything is spinning ...

new quantum number: spin quantum number

for electrons: spin quantum number can ONLY be



up



down

Pauli's exclusion principle

Two electrons in a system cannot have the same quantum numbers!

quantum numbers:

main n : 1,2,3 ...

orbital l : 0, 1, ..., $n-1$

magnetic m : $-l, \dots, l$

spin: up, down

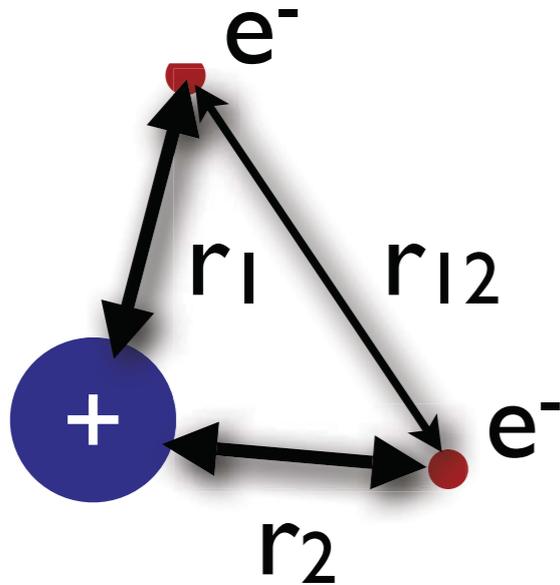


Periodic table of elements

Ryhmä → ↓ Jakso	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
1	1 H																	2 He
2	3 Li	4 Be											5 B	6 C	7 N	8 O	9 F	10 Ne
3	11 Na	12 Mg											13 Al	14 Si	15 P	16 S	17 Cl	18 Ar
4	19 K	20 Ca	21 Sc	22 Ti	23 V	24 Cr	25 Mn	26 Fe	27 Co	28 Ni	29 Cu	30 Zn	31 Ga	32 Ge	33 As	34 Se	35 Br	36 Kr
5	37 Rb	38 Sr	39 Y	40 Zr	41 Nb	42 Mo	43 Tc	44 Ru	45 Rh	46 Pd	47 Ag	48 Cd	49 In	50 Sn	51 Sb	52 Te	53 I	54 Xe
6	55 Cs	56 Ba		72 Hf	73 Ta	74 W	75 Re	76 Os	77 Ir	78 Pt	79 Au	80 Hg	81 Tl	82 Pb	83 Bi	84 Po	85 At	86 Rn
7	87 Fr	88 Ra		104 Rf	105 Db	106 Sg	107 Bh	108 Hs	109 Mt	110 Ds	111 Rg	112 Uub	113 Uut	114 Fl	115 Uup	116 Lv	117 Uus	118 Uuo
Lantanoidit			57 La	58 Ce	59 Pr	60 Nd	61 Pm	62 Sm	63 Eu	64 Gd	65 Tb	66 Dy	67 Ho	68 Er	69 Tm	70 Yb	71 Lu	
Aktinoidit			89 Ac	90 Th	91 Pa	92 U	93 Np	94 Pu	95 Am	96 Cm	97 Bk	98 Cf	99 Es	100 Fm	101 Md	102 No	103 Lr	

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Next? Helium?



$$H\psi = E\psi$$

$$\left[H_1 + H_2 + W \right] \psi(\vec{r}_1, \vec{r}_2) = E\psi(\vec{r}_1, \vec{r}_2)$$

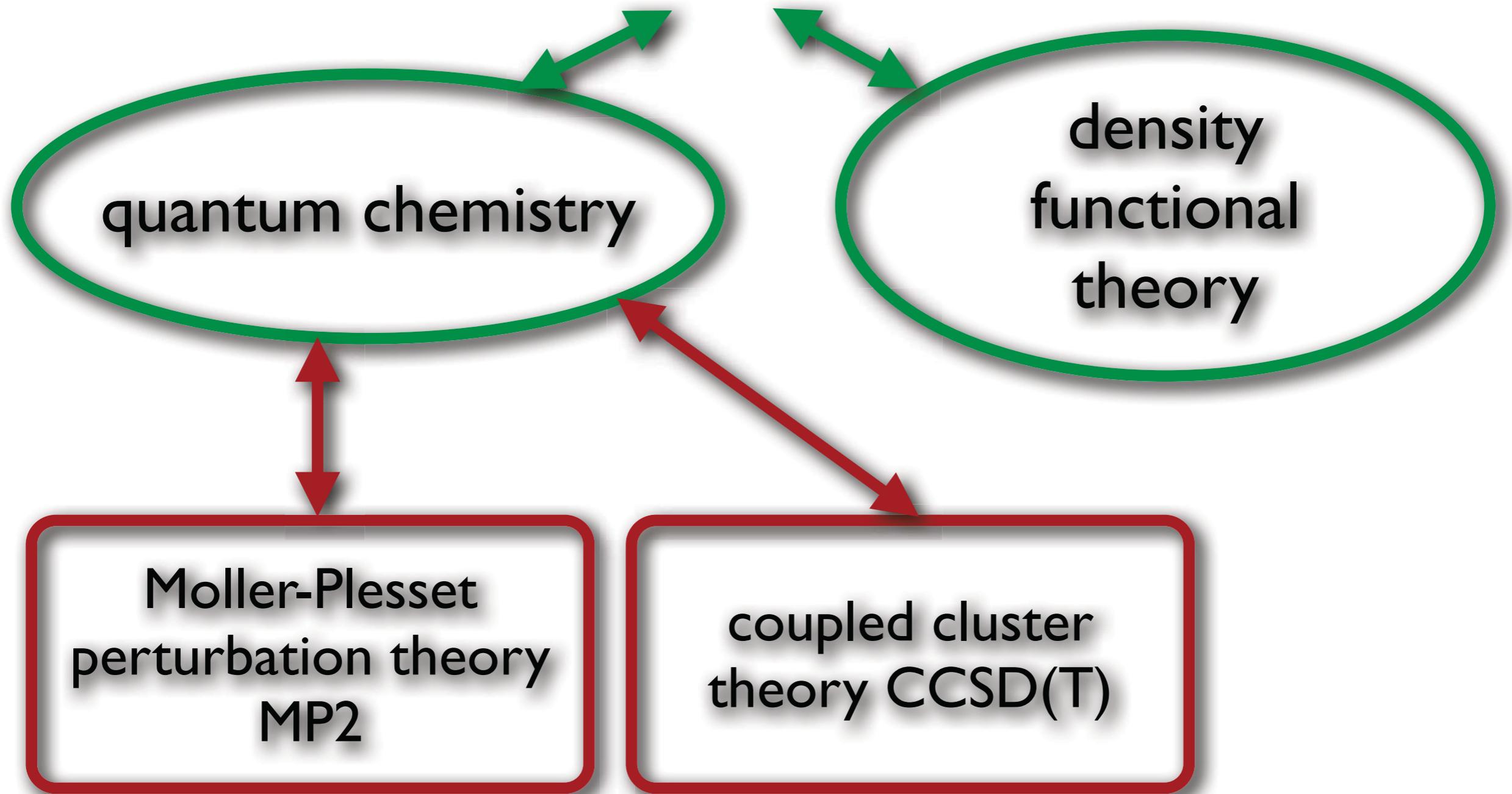
$$\left[T_1 + V_1 + T_2 + V_2 + W \right] \psi(\vec{r}_1, \vec{r}_2) = E\psi(\vec{r}_1, \vec{r}_2)$$

$$\left[-\frac{\hbar^2}{2m} \nabla_1^2 - \frac{e^2}{4\pi\epsilon_0 r_1} - \frac{\hbar^2}{2m} \nabla_2^2 - \frac{e^2}{4\pi\epsilon_0 r_2} + \frac{e^2}{4\pi\epsilon_0 r_{12}} \right] \psi(\vec{r}_1, \vec{r}_2) = E\psi(\vec{r}_1, \vec{r}_2)$$

cannot be solved analytically

problem!

Solutions

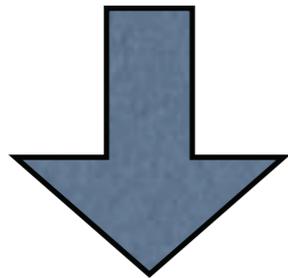


The Two Paths

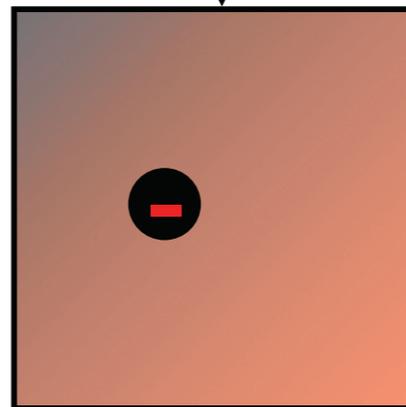
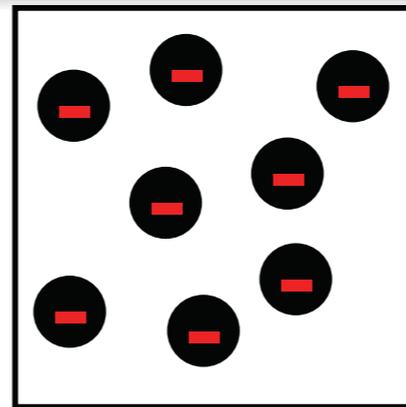
Ψ is a wave function of all positions & time.

$$\left[-\frac{\hbar^2}{2m} \nabla^2 + V(\vec{r}, t) \right] \psi(\vec{r}, t) = i\hbar \frac{\partial}{\partial t} \psi(\vec{r}, t)$$

Chemists (mostly)

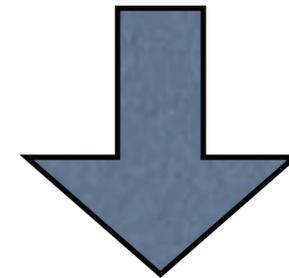


Ψ = something simpler



“mean field” methods

Physicists (mostly)



H = something simpler



Walter Kohn

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Working with the Density

$$E[n] = T[n] + V_{ii} + V_{ie}[n] + V_{ee}[n]$$

kinetic

ion-electron

ion-ion

electron-electron

n=#	$\Psi(N^{3n})$	$\rho(N^3)$
1	8	8
10	10^9	8
100	10^{90}	8
1,000	10^{900}	8

$$\left[-\frac{\hbar^2}{2m} \nabla^2 + V_s(\vec{r}) \right] \phi_i(\vec{r}) = \epsilon_i \phi_i(\vec{r}),$$

$$V_s = V + \int \frac{e^2 n_s(\vec{r}')}{|\vec{r} - \vec{r}'|} d^3 r' + V_{XC}[n_s(\vec{r})],$$

ion potential

Hartree potential

exchange-correlation potential

Why DFT?

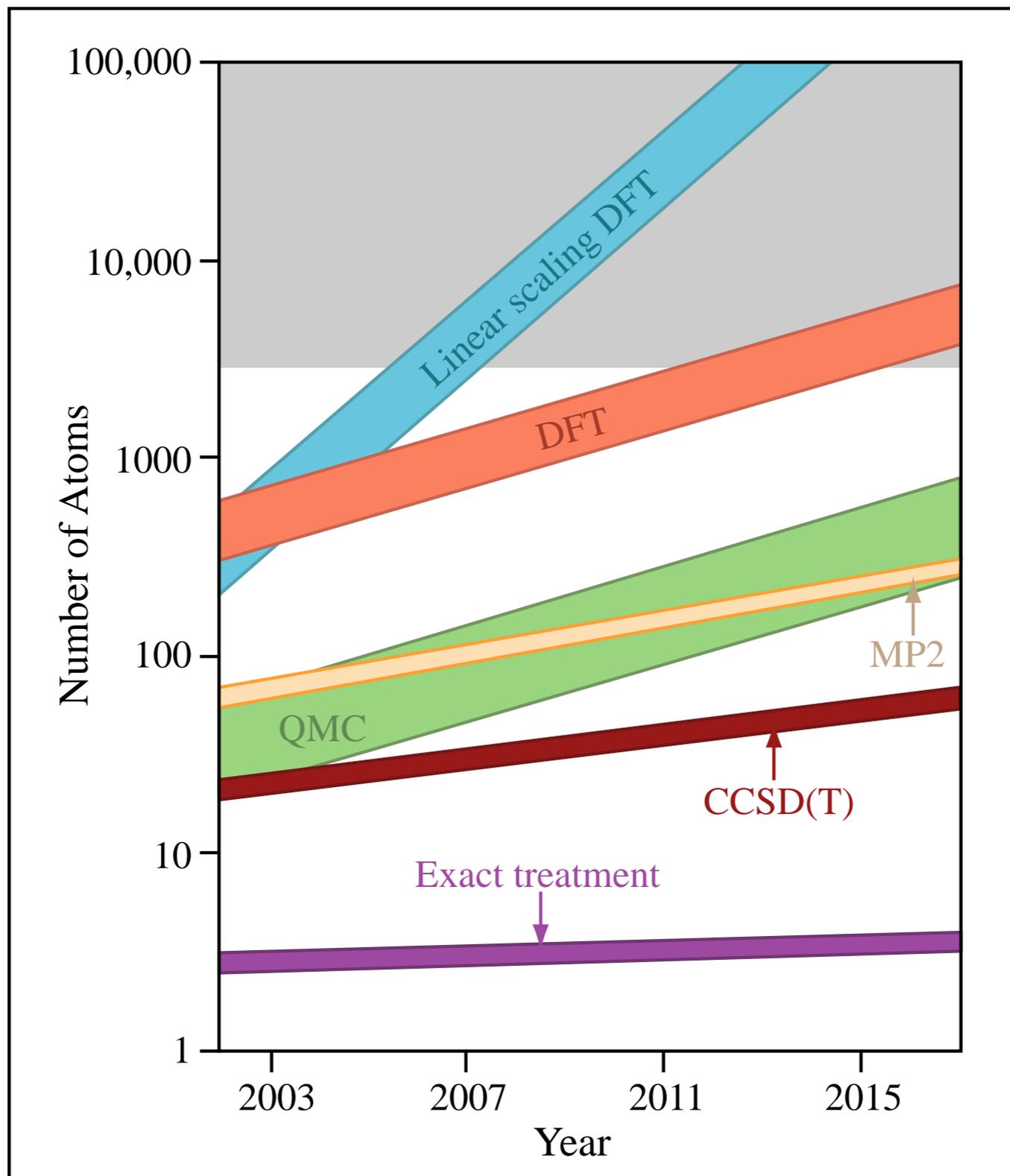


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Density functional theory

$$E[n] = T[n] + V_{ii} + V_{ie}[n] + V_{ee}[n]$$

kinetic ion-ion ion-electron electron-electron

electron density

$$n(\vec{r}) = \sum_i |\phi_i(\vec{r})|^2$$

$$E_{\text{ground state}} = \min_{\phi} E[n]$$

Find the wave functions that minimize the energy using a functional derivative.

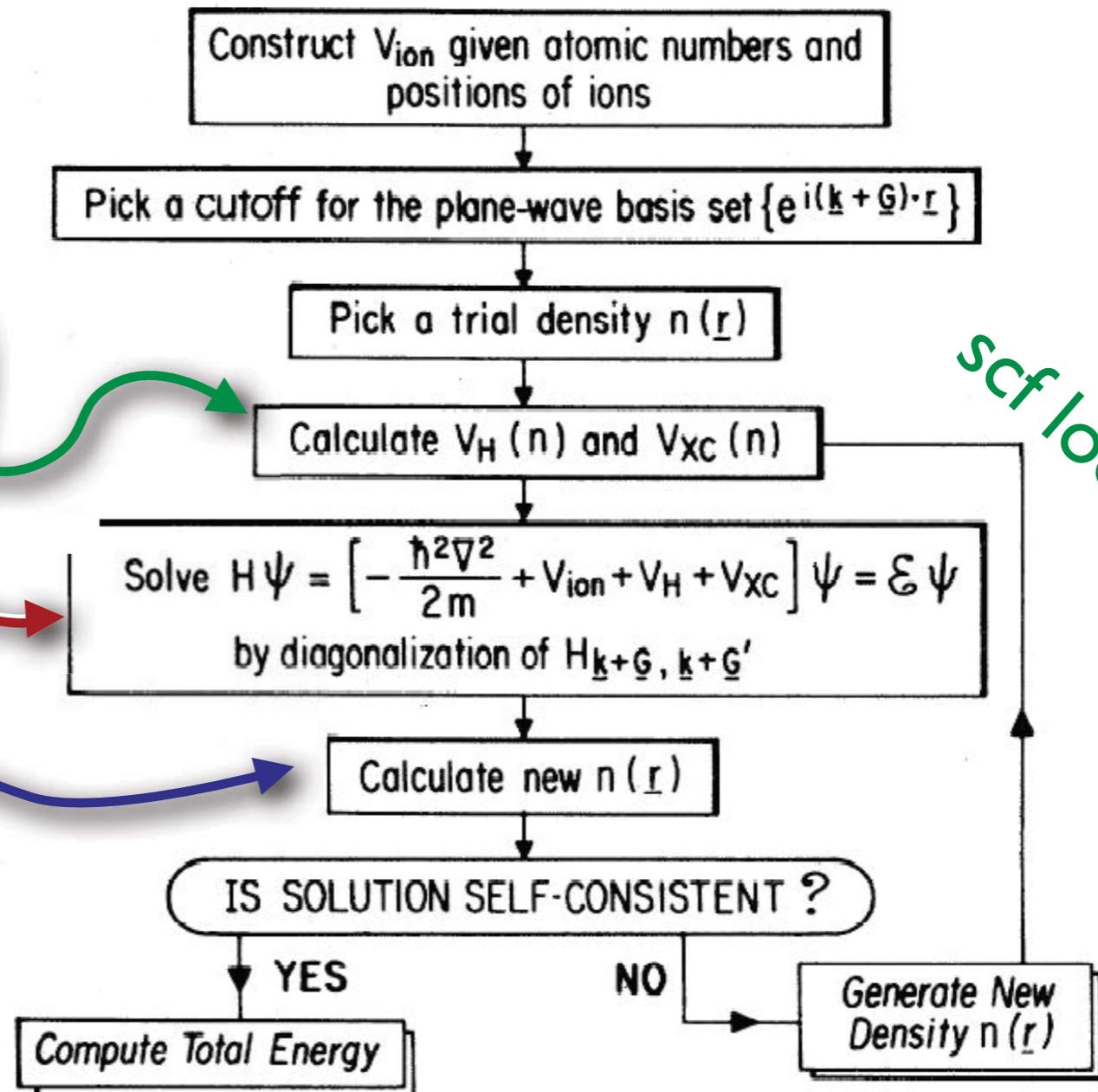
Self-consistent cycle

Kohn-Sham equations

$$\left[-\frac{\hbar^2}{2m} \nabla^2 + V_s(\vec{r}) \right] \phi_i(\vec{r}) = \epsilon_i \phi_i(\vec{r}),$$

$$V_s = V + \int \frac{e^2 n_s(\vec{r}')}{|\vec{r} - \vec{r}'|} d^3 r' + V_{XC}[n_s(\vec{r})],$$

$$n(\vec{r}) = \sum_i |\phi_i(\vec{r})|^2$$



Density functional theory

Only one problem:
 v_{xc} not known!!!

approximations necessary



local density
approximation
LDA

general gradient
approximation
GGA

- structure
- bulk modulus
 - binding energies
 - reaction paths
 - forces
 - pressure
 - stress
 - ...
- shear modulus
- elastic constants
- vibrational properties
- sound velocity

Convergence for molecules

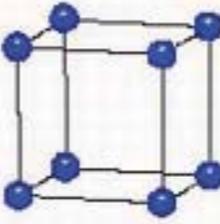
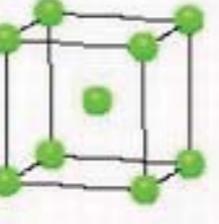
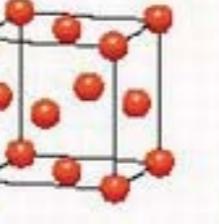
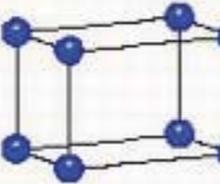
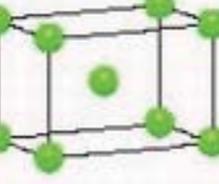
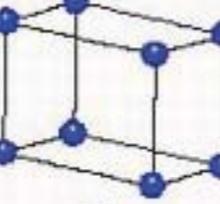
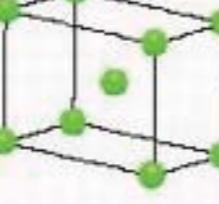
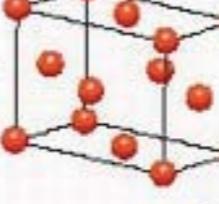
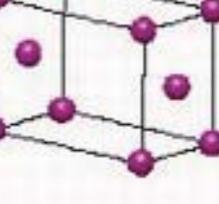
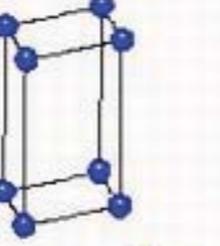
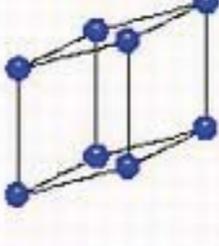
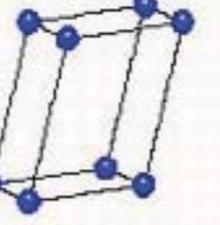
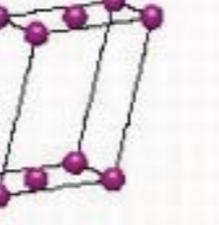
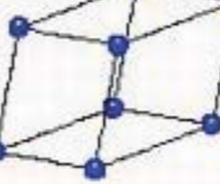
Was my box big enough?

Was my basis big enough?

Did I exit the scf loop at the right point?



Crystal symmetries

<p>CUBIC $a = b = c$ $\alpha = \beta = \gamma = 90^\circ$</p>	<p>P</p> 	<p>I</p> 	<p>F</p> 	
<p>TETRAGONAL $a = b \neq c$ $\alpha = \beta = \gamma = 90^\circ$</p>	<p>P</p> 	<p>I</p> 		
<p>ORTHORHOMBIC $a \neq b \neq c$ $\alpha = \beta = \gamma = 90^\circ$</p>	<p>P</p> 	<p>I</p> 	<p>F</p> 	<p>C</p> 
<p>HEXAGONAL $a = b \neq c$ $\alpha = \beta = 90^\circ$ $\gamma = 120^\circ$</p>	<p>P</p> 	<p>TRIGONAL $a = b = c$ $\alpha = \beta = \gamma \neq 90^\circ$</p>	<p>P</p> 	
<p>MONOCLINIC $a \neq b \neq c$ $\alpha = \gamma = 90^\circ$ $\beta \neq 120^\circ$</p>	<p>P</p> 	<p>C</p> 		
<p>TRICLINIC $a \neq b \neq c$ $\alpha \neq \beta \neq \gamma \neq 90^\circ$</p>	<p>P</p> 			

4 Types of Unit Cell
P = Primitive
I = Body-Centred
F = Face-Centred
C = Side-Centred
 +
7 Crystal Classes
 → **14 Bravais Lattices**

S = simple
BC = body centered
FC = face centered

The inverse lattice

The **real space lattice** is described by three basis vectors:

$$\vec{R} = n_1 \vec{a}_1 + n_2 \vec{a}_2 + n_3 \vec{a}_3$$

The **inverse lattice** is described by three basis vectors:

$$\vec{G} = m_1 \vec{b}_1 + m_2 \vec{b}_2 + m_3 \vec{b}_3$$

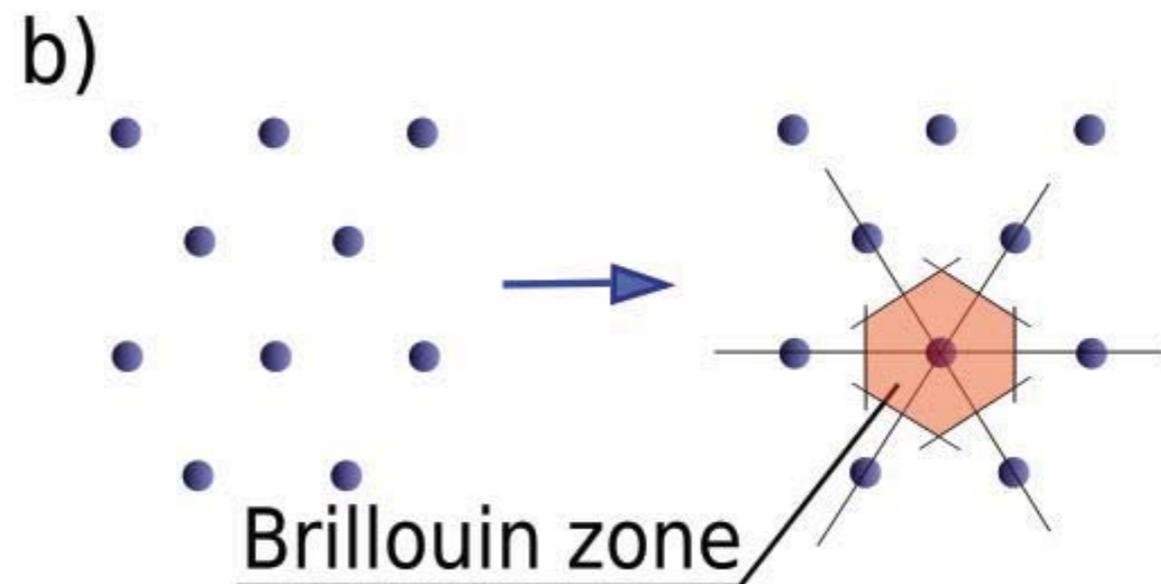
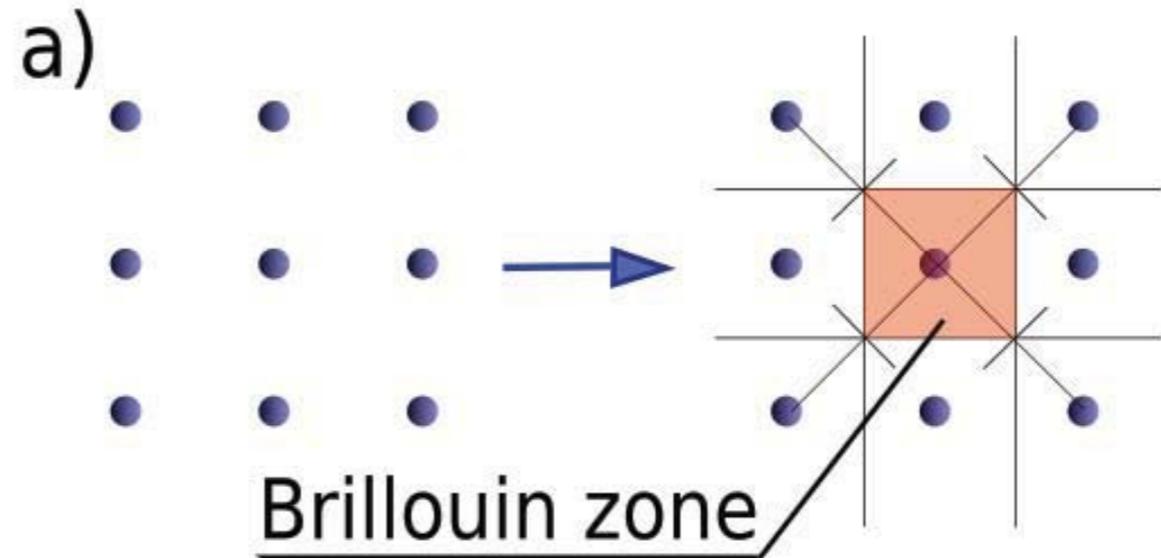
$$\mathbf{b}_1 = 2\pi \frac{\mathbf{a}_2 \times \mathbf{a}_3}{\mathbf{a}_1 \cdot (\mathbf{a}_2 \times \mathbf{a}_3)} \quad \mathbf{b}_2 = 2\pi \frac{\mathbf{a}_3 \times \mathbf{a}_1}{\mathbf{a}_2 \cdot (\mathbf{a}_3 \times \mathbf{a}_1)} \quad \mathbf{b}_3 = 2\pi \frac{\mathbf{a}_1 \times \mathbf{a}_2}{\mathbf{a}_3 \cdot (\mathbf{a}_1 \times \mathbf{a}_2)}$$

$$e^{i\mathbf{G} \cdot \mathbf{R}} = 1 \quad \longrightarrow \quad \psi(\vec{r}) = \sum_j c_j e^{i\mathbf{G}_j \cdot \mathbf{r}}$$

automatically periodic in R!

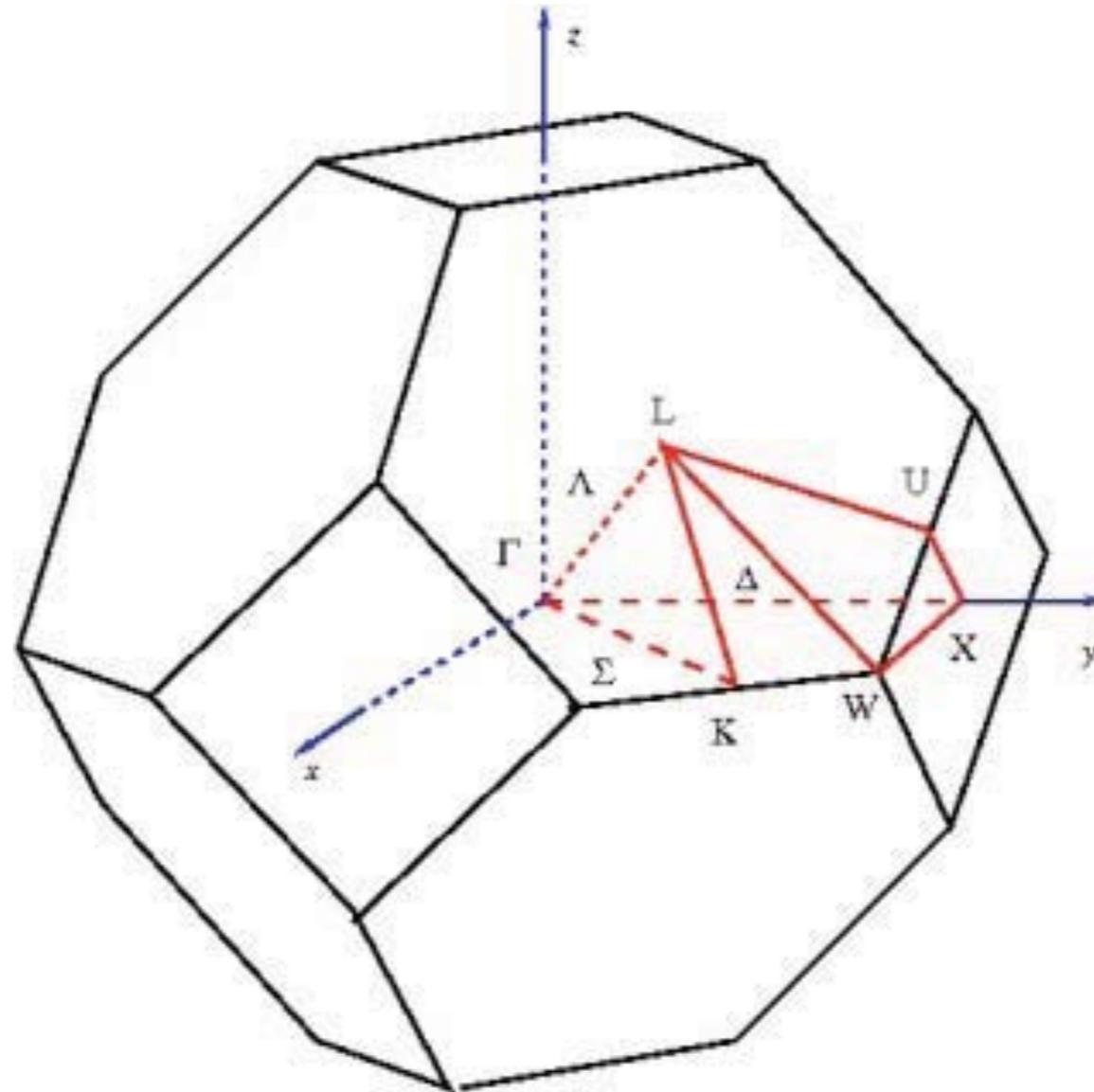
The Brillouin zone

inverse lattice



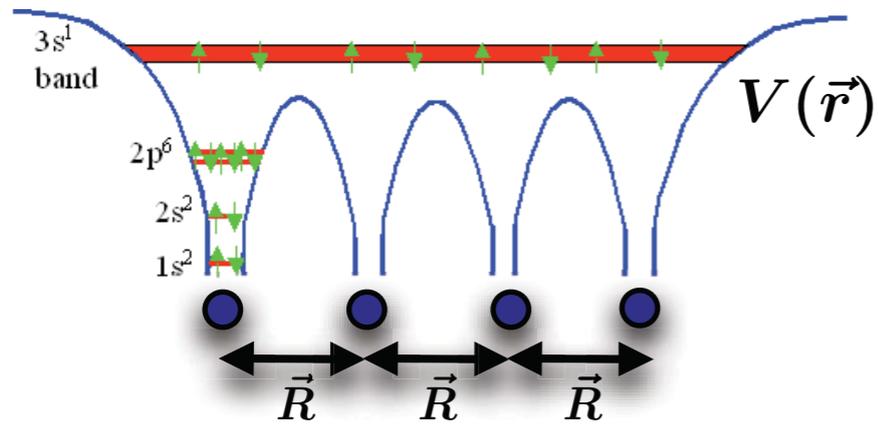
The Brillouin zone is a special unit cell of the inverse lattice.

The Brillouin zone



Brillouin zone of the FCC lattice

Periodic potentials



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$$V(\vec{r}) = V(\vec{r} + \vec{R})$$

lattice vector

Bloch's theorem

$$\psi_{\vec{k}}(\vec{r}) = e^{i\vec{k}\cdot\vec{r}} u_{\vec{k}}(\vec{r})$$

$$u_{\vec{k}}(\vec{r}) = u_{\vec{k}}(\vec{r} + \vec{R})$$

NEW quantum number k that lives in the inverse lattice!

Inverse lattice

Results of Bloch's theorem:

$$\psi_{\mathbf{k}}(\vec{r} + \vec{R}) = \psi_{\mathbf{k}}(\vec{r}) e^{i\mathbf{k} \cdot \mathbf{R}}$$

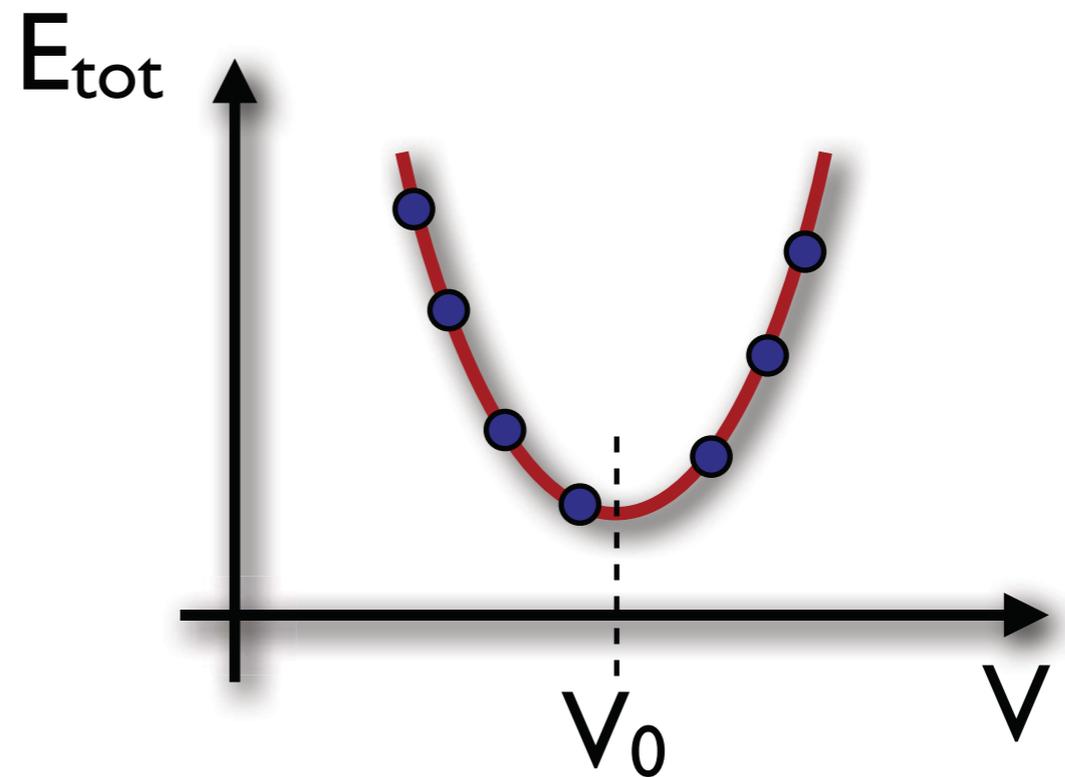
$$|\psi_{\mathbf{k}}(\vec{r} + \vec{R})|^2 = |\psi_{\mathbf{k}}(\vec{r})|^2 \quad \text{charge density is lattice periodic}$$

if solution $\psi_{\vec{k}}(\vec{r}) \longrightarrow \psi_{\vec{k} + \vec{G}}(\vec{r})$ also solution

$$\text{with } E_{\vec{k}} = E_{\vec{k} + \vec{G}}$$

Structural properties

finding the
stress/pressure
and the bulk
modulus



$$p = -\frac{\partial E}{\partial V}$$

$$\sigma_{\text{bulk}} = -V \frac{\partial p}{\partial V} = V \frac{\partial^2 E}{\partial V^2}$$

Calculating the band structure

3-step procedure

1. Find the converged ground state density and potential.
2. For the converged potential calculate the energies at **k-points along lines**.
3. Use some software to plot the band structure.

Kohn-Sham equations

$$\left[-\frac{\hbar^2}{2m} \nabla^2 + V_s(\vec{r}) \right] \phi_i(\vec{r}) = \epsilon_i \phi_i(\vec{r}),$$

$$V_s = V + \int \frac{e^2 n_s(\vec{r}')}{|\vec{r} - \vec{r}'|} d^3 r' + V_{XC}[n_s(\vec{r})],$$

$$n(\vec{r}) = \sum_i |\phi_i(\vec{r})|^2$$

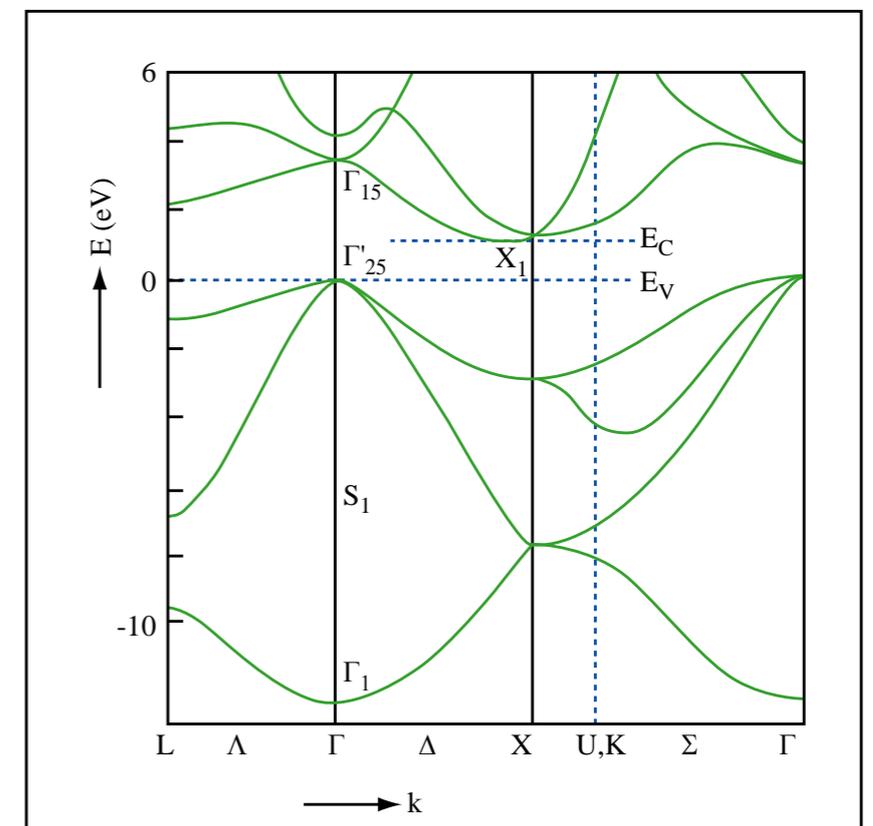


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Metal/insulator

silicon

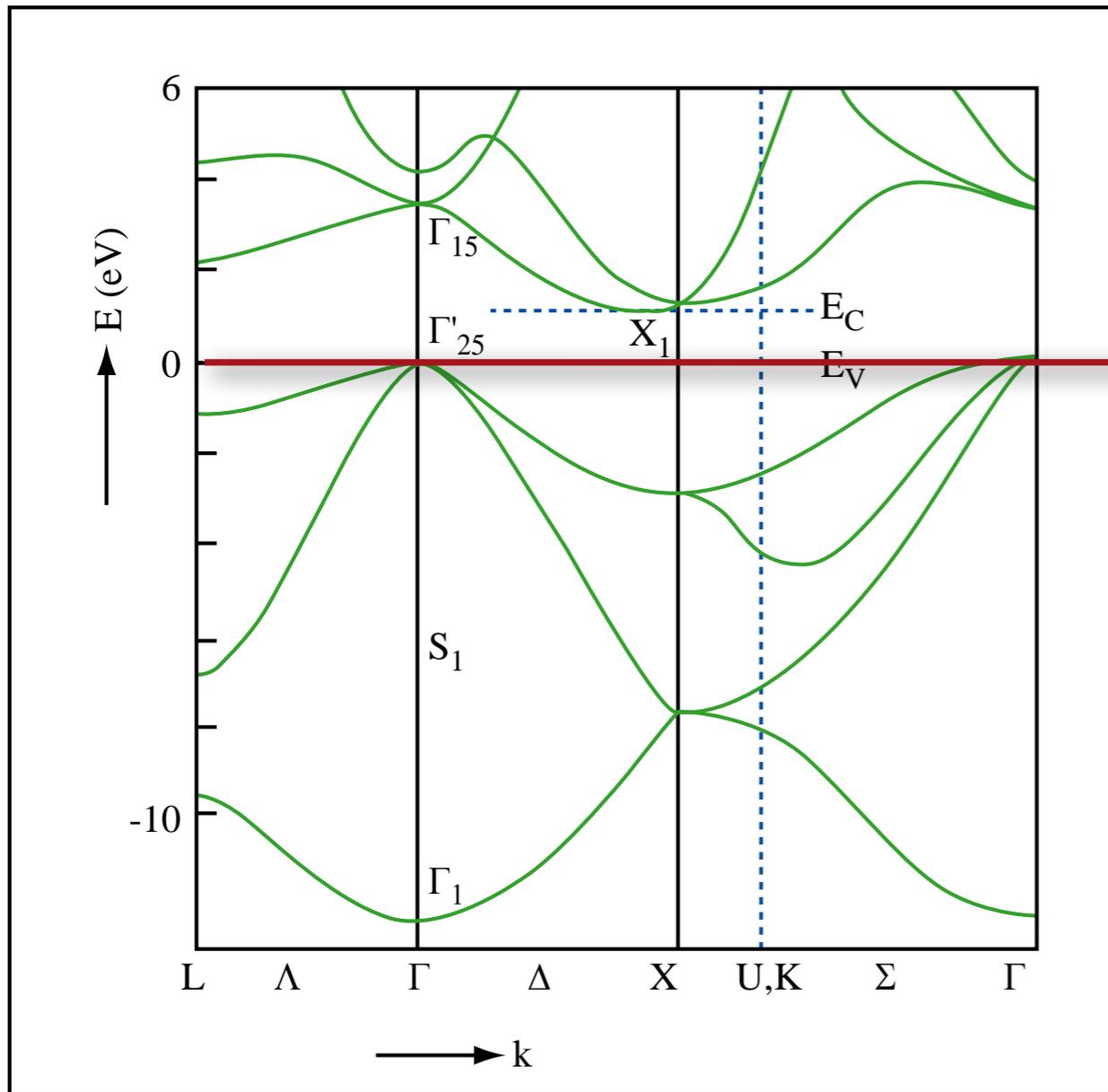


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Are any bands crossing the Fermi energy?

YES: METAL

NO: INSULATOR

Fermi energy

Number of electron in unit cell:

EVEN: MAYBE INSULATOR

ODD: FOR SURE METAL

Simple optical properties

$$E = h\nu$$

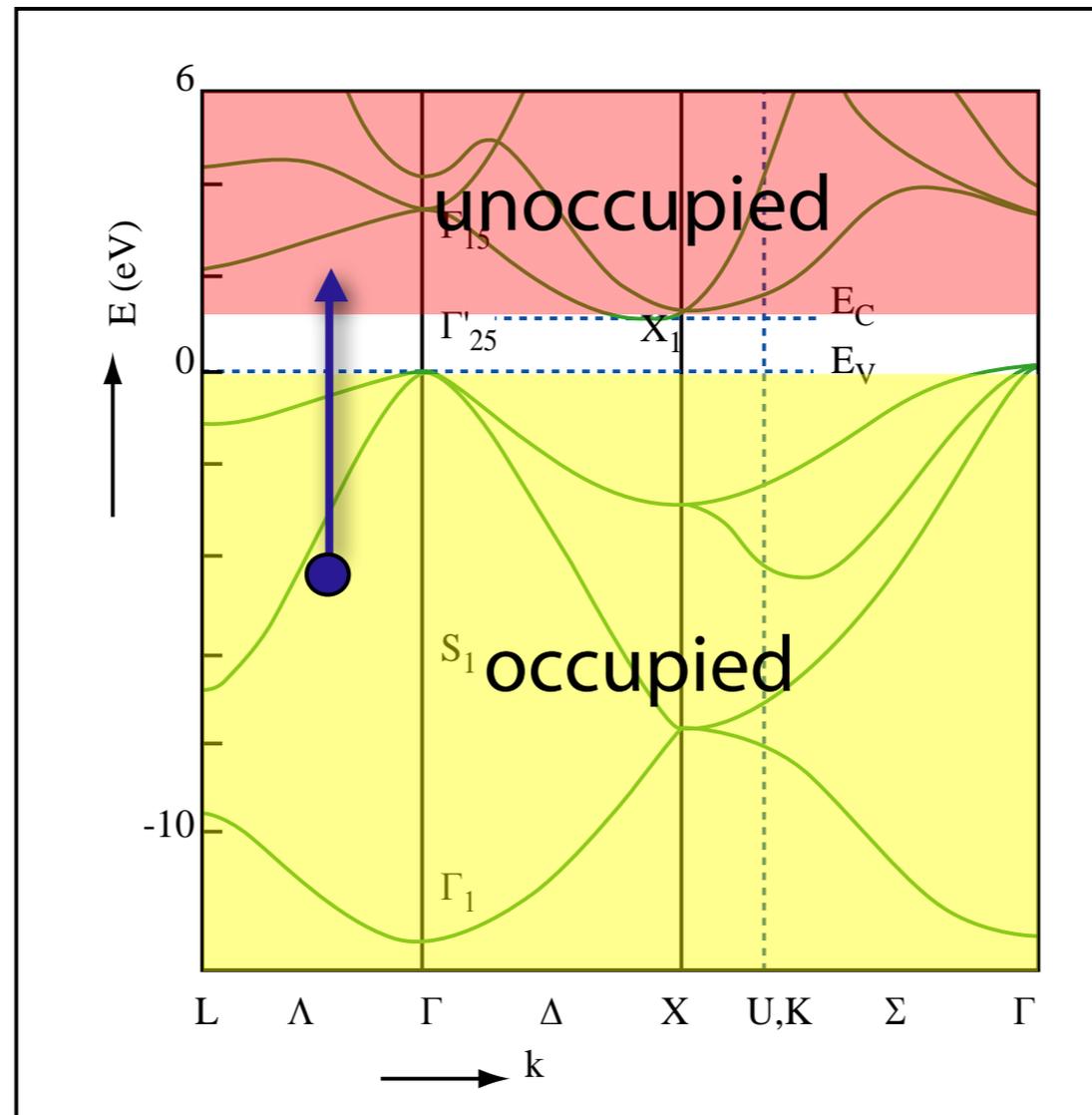
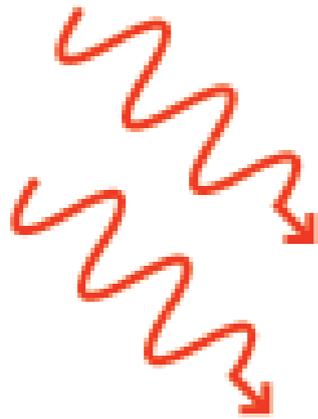


Image by MIT OpenCourseWare.

shortest wave length visible 400 nm ;
corresponds to photon with $E = 3.1$ eV

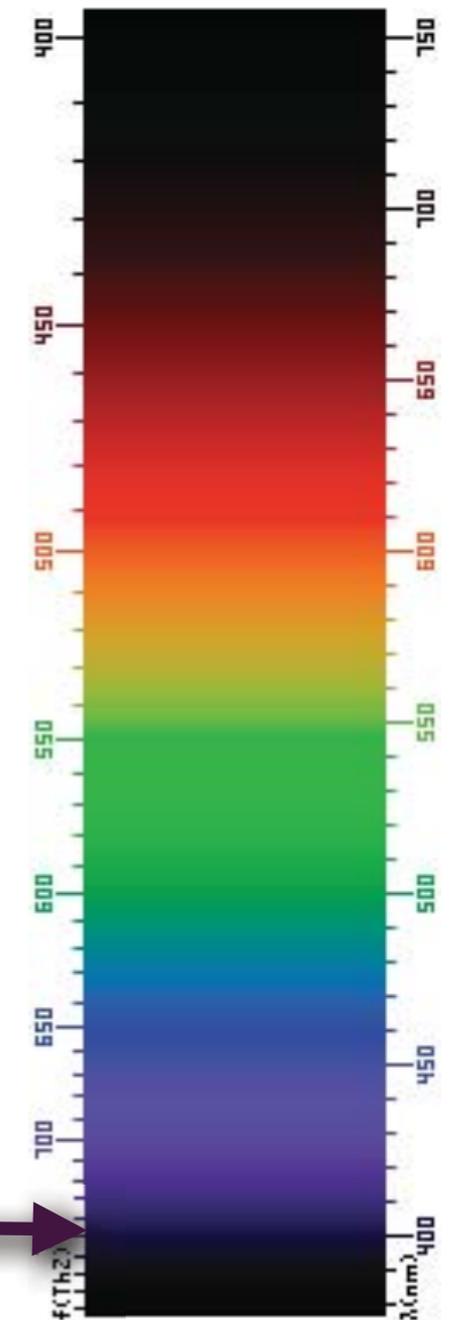
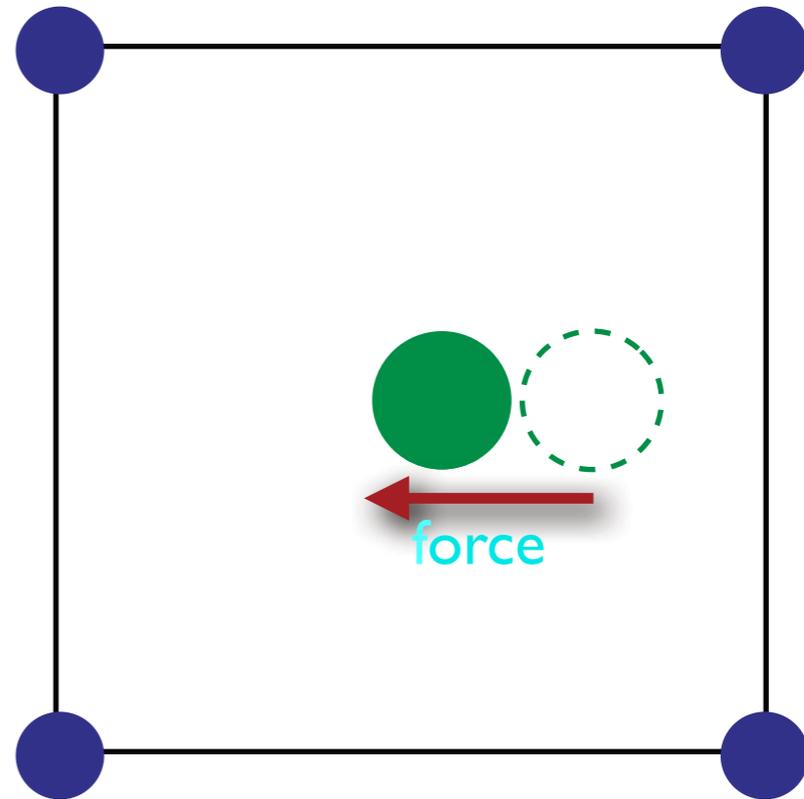


Image in the public domain.

Vibrational properties

lattice vibrations
are called: **phonons**

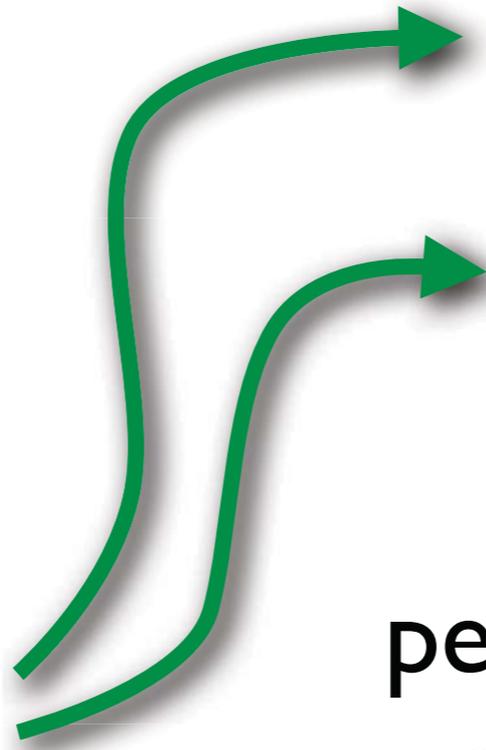


What is the frequency of this vibration?

Magnetization

iron

```
&control
  calculation = 'scf',
  pseudo_dir =
/
&system
  ibray=3,
  celldm(1)=5.25,
  nat=1,
  ntyp=1,
  ecutwfc=25.0,
  occupations='smearing',
  smearing='gauss',
  degauss=0.05,
  nspin=1
  starting_magnetization(1)=0.0
/
&electrons
  conv_thr=1.0d-10
/
ATOMIC_SPECIES
Fe 55.847 iron.UPF
ATOMIC_POSITIONS {crystal}
Fe 0.0 0.0 0.0
K_POINTS {automatic}
4 4 4 1 1 1
```



nspin=1: non spin-polarized
nspin=2: spin-polarized

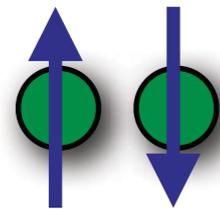
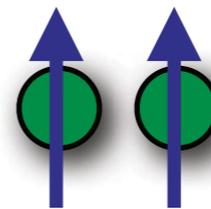
starting magnetization
for each atom

perform three calculations
and find lowest energy:

non spin-polarized



spin-polarized



ferromagnetic

anti-ferromagnetic

With the band structure and DOS we find:

- electrical conductivity (insulator/metal/semiconductor)
- thermal conductivity
- optical properties
- magnetization/polarization
- magnetic/electric properties
- ...

Convergence for solids

*Was my k-mesh
fine enough?*

*Was my basis big
enough?*



*Did I exit the scf
loop at the right
point?*

Summary of properties

structural properties

electrical properties

optical properties

magnetic properties

vibrational properties

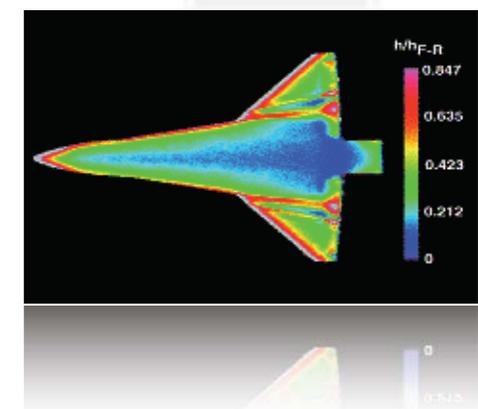
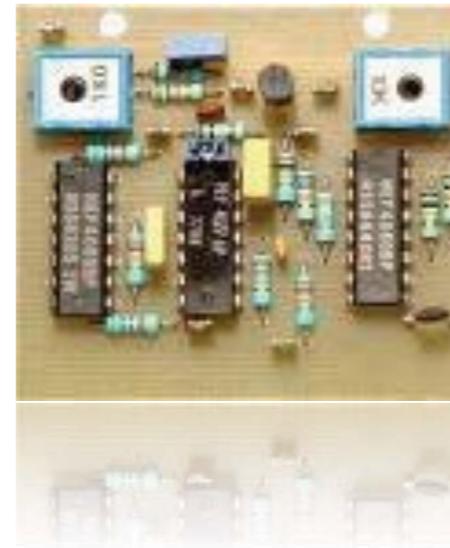
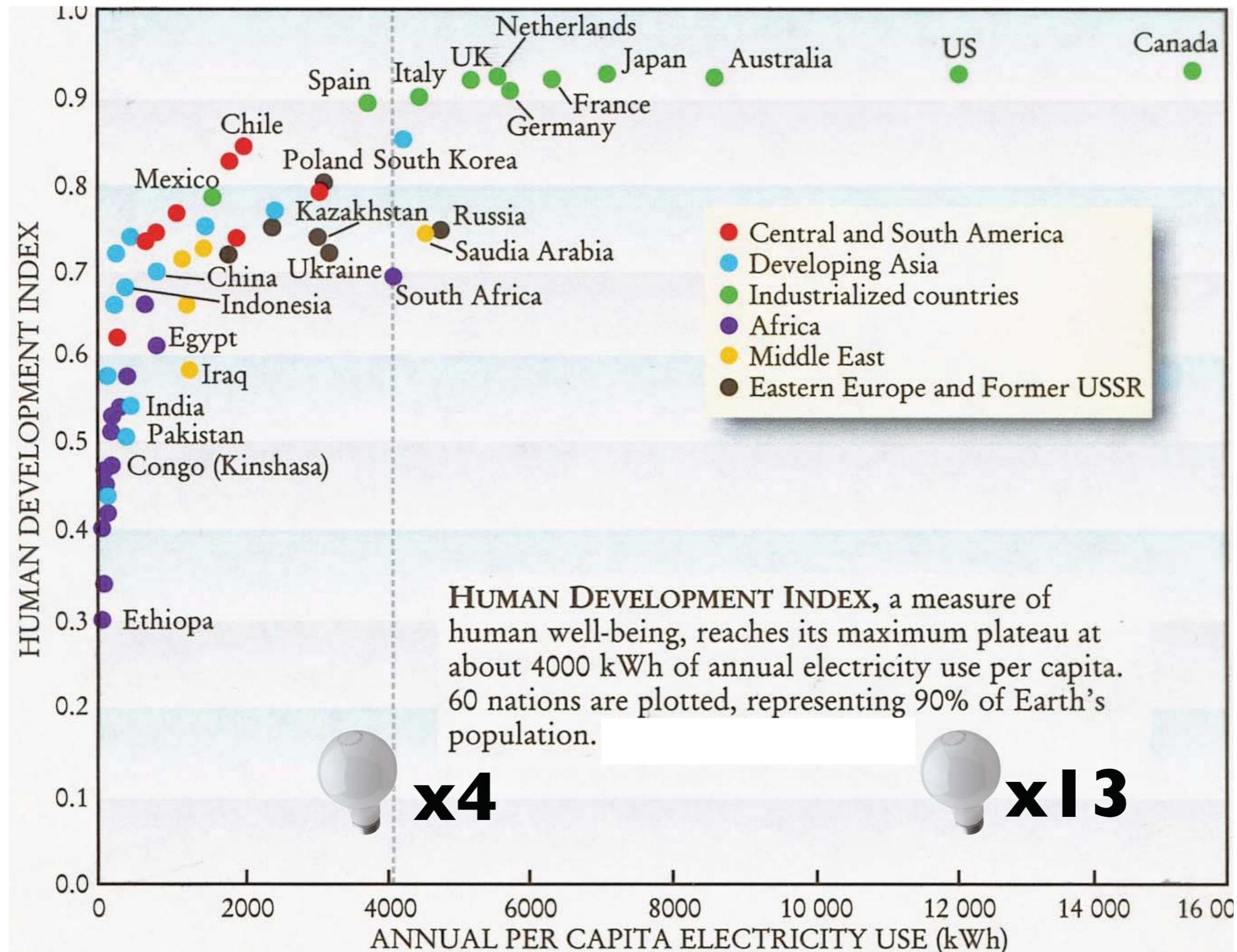


Image of Airbus A380 on [Wikimedia Commons](#). License: CC-BY-SA. Images of circuit board, phone, hard drive © sources unknown. All rights reserved. This content is excluded from our Creative Commons license. For more information, see <http://ocw.mit.edu/help/faq-fair-use/>. Aerothermodynamic image of shuttle, courtesy [NASA](#).

It's Not *Only* About Warming: Abundance of Affordable Energy Resources Can Uplift the World

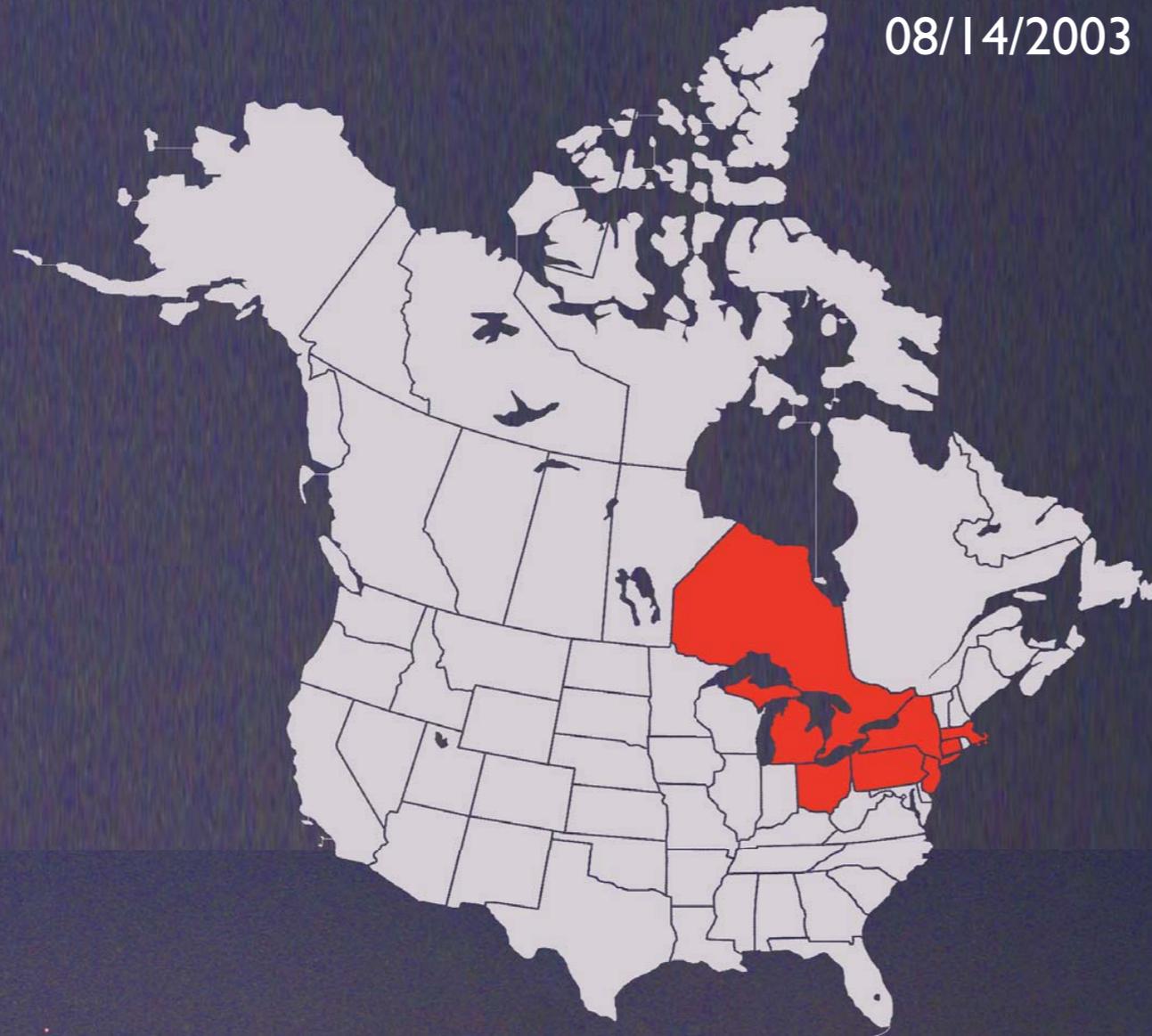


HUMAN WELL-BEING INCREASES WITH INCREASED PER-CAPITA ENERGY USE

It's Not *Only* About Warming: Abundance of Affordable Energy Resources Can Uplift the World

North American Electrical Blackout

08/14/2003



... August 15 ...
just 24 hours into blackout
Air Pollution was Reduced

SO₂ >90%

O₃ ~50%

Light Scattering
Particles ~70%

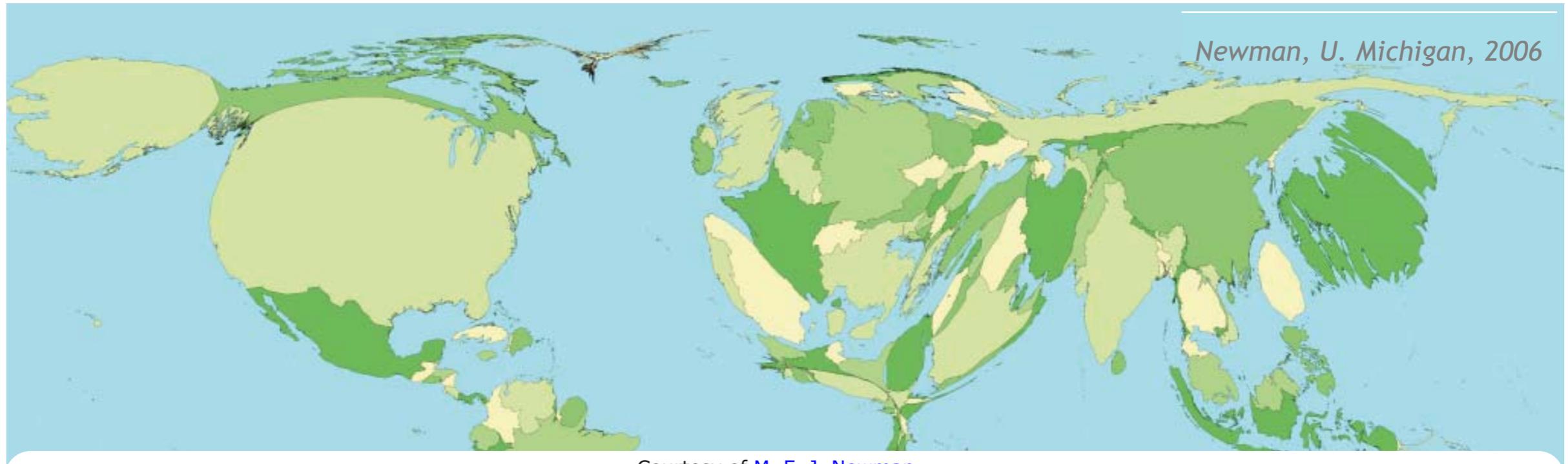
“This clean air benefit was realized
over much of eastern U.S.”

Marufu et al., Geophysical Research
Letters 2004

by 4:13 pm 256 power plants were off-line

Courtesy: Vladimir Bulovic

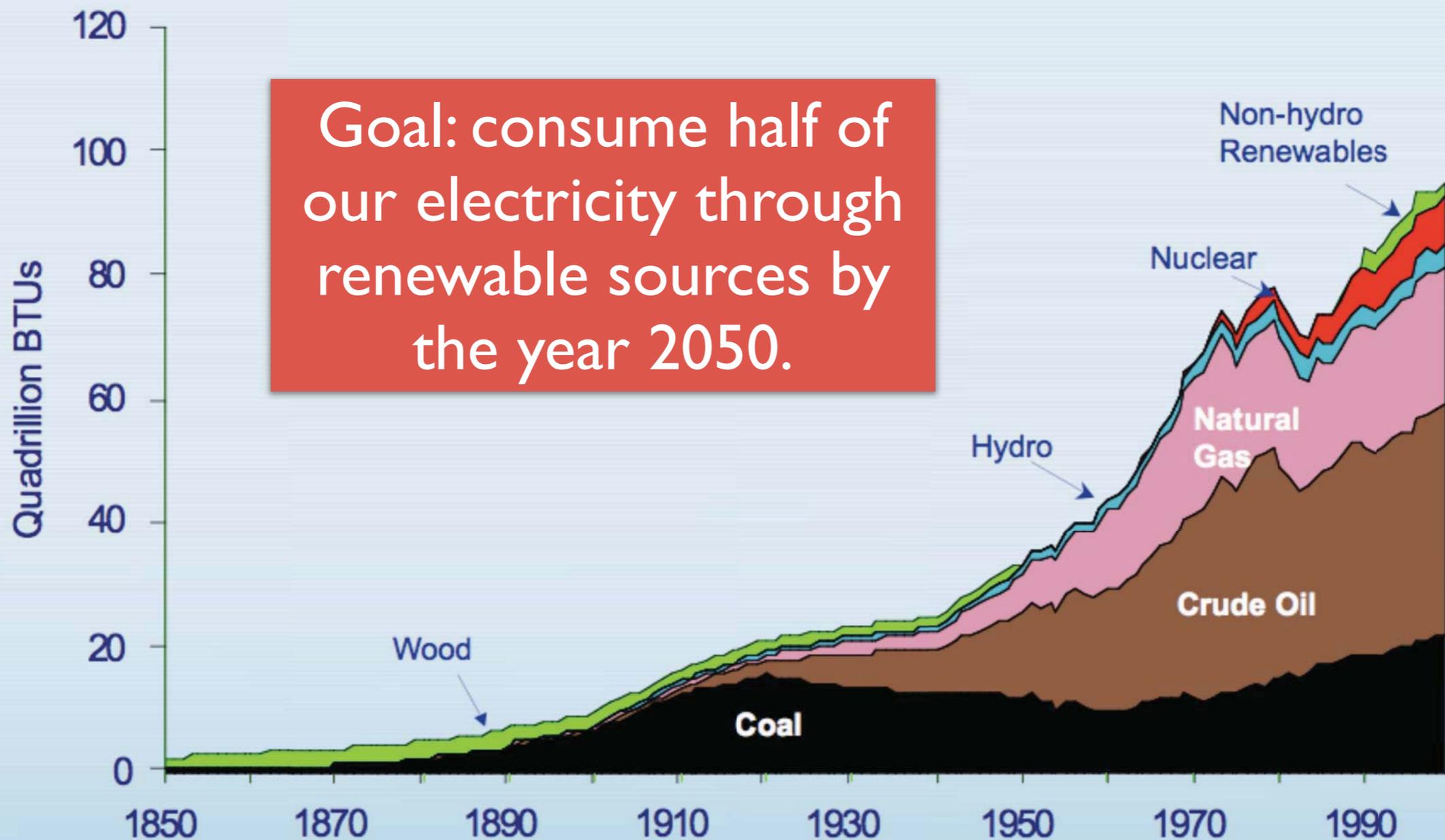
Map of the World Scaled to Energy Consumption by Country



Courtesy of M. E. J. Newman.

- In 2002 the world burned energy at a rate of 13.5 TW
- How fast will we burn energy in 2050?
- (assume 9 billion people)
- If we use energy like in U.S. we will need **102 TW**
- Conservative estimate: 28~35 TW

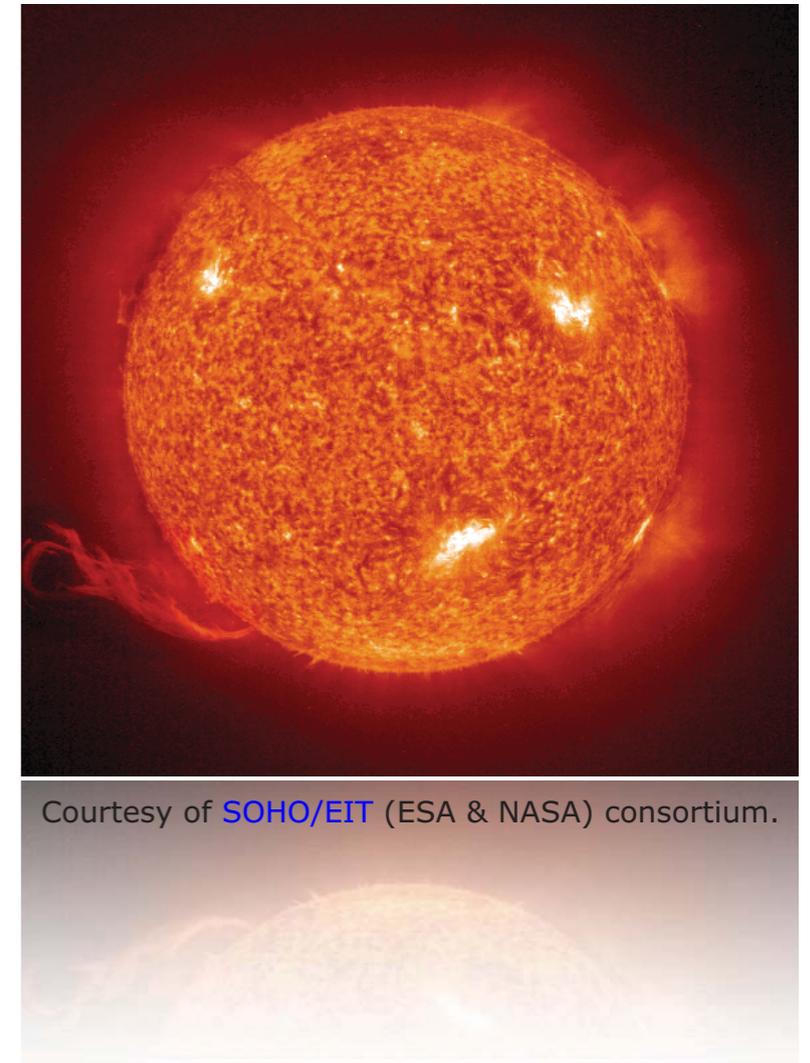
U.S. Energy Consumption



Source: 1850-1949, Energy Perspectives: A Presentation of Major Energy and Energy-Related Data, U.S. Department of the Interior, 1975; 1950-1996, Annual Energy Review 1996, Table 1.3. Note: Between 1950 and 1990, there was no reporting of non-utility use of renewables. 1997-1999, Annual Energy Review 1999, Table F1b.

Energy from the Sun

- Energy released by an earthquake of magnitude 8 (10^{17} J):
 - the sun delivers this in one second
- Energy humans use annually (10^{20} J):
 - sun delivers this in one hour
- Earth's total resources of oil (3 trillion barrels, 10^{22} J):
 - the sun delivers this in two days



Courtesy of [SOHO/EIT](#) (ESA & NASA) consortium.

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3.021J / 1.021J / 10.333J / 18.361J / 22.00J Introduction to Modelling and Simulation
Spring 2012

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