

2440-14

**16th International Workshop on Computational Physics and Materials Science:
Total Energy and Force Methods**

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Atomic-scale design of energy materials

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Atomic-scale design of materials for water splitting and accurate correlation energies from ACFDT



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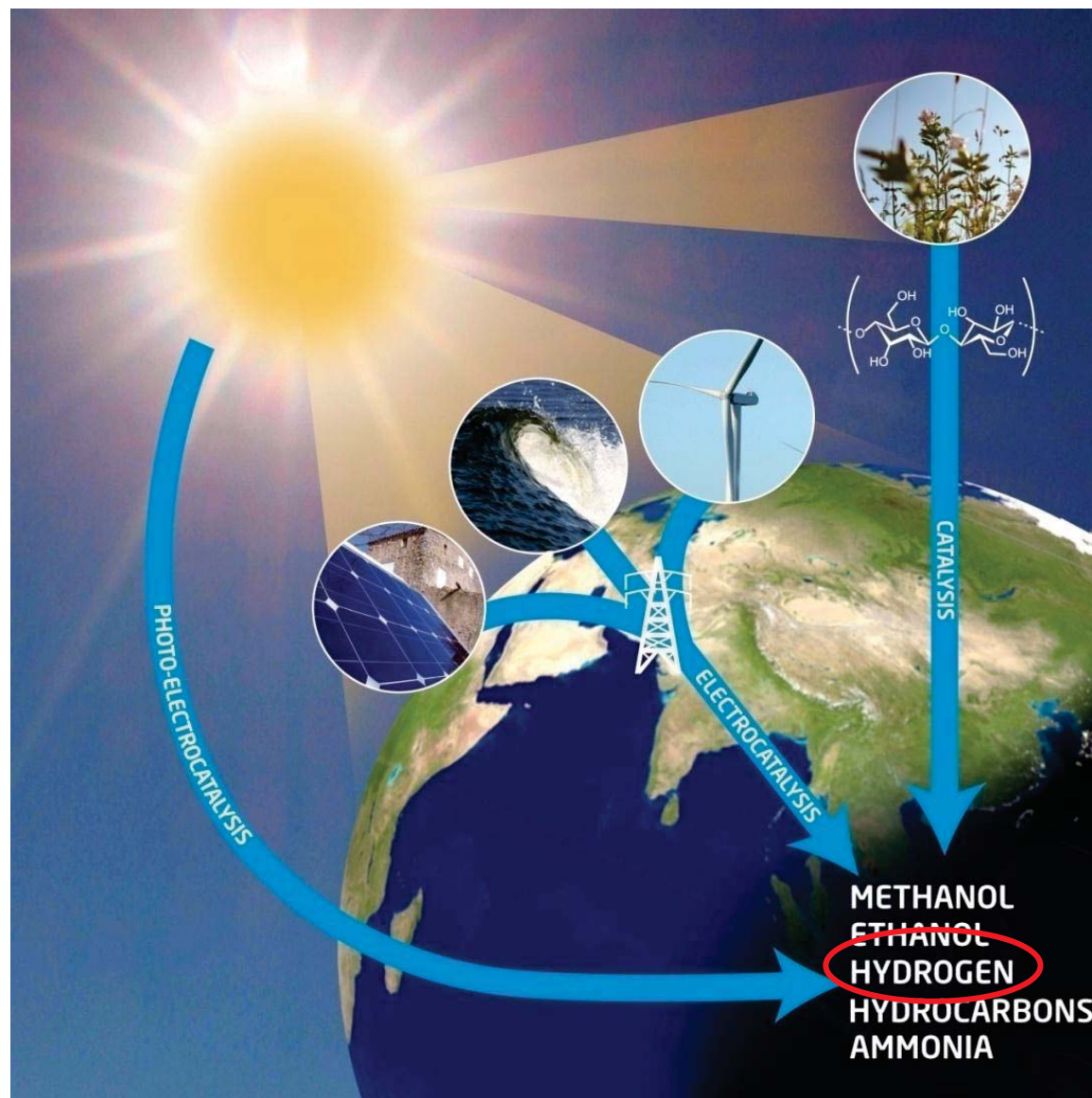


Outline

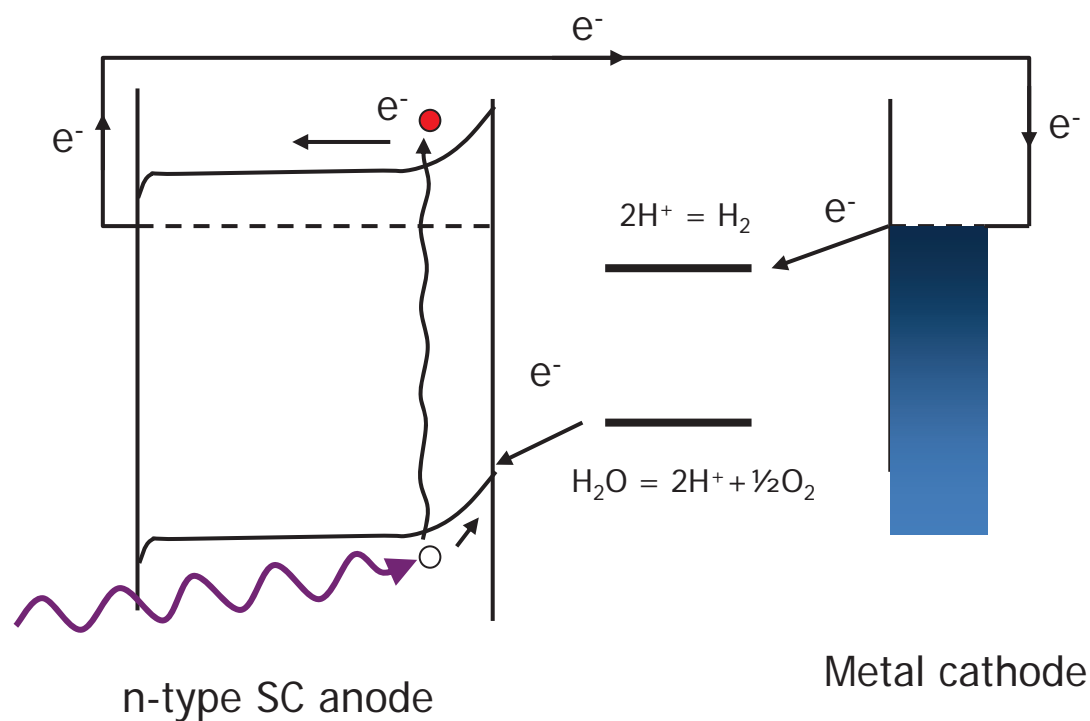
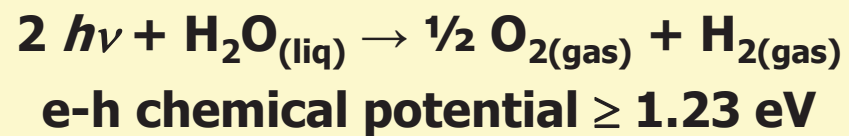
- Basic principles of photocatalytic water splitting
- Evaluating stability, band gaps and band edges
- Computational screening of perovskites
- Materials for 1- and 2-photon water splitting

- Correlation energies from the ACDFT
- RPA calculations for graphene@metals
- Beyond RPA: The renormalized ALDA kernel

From sun light to fuels

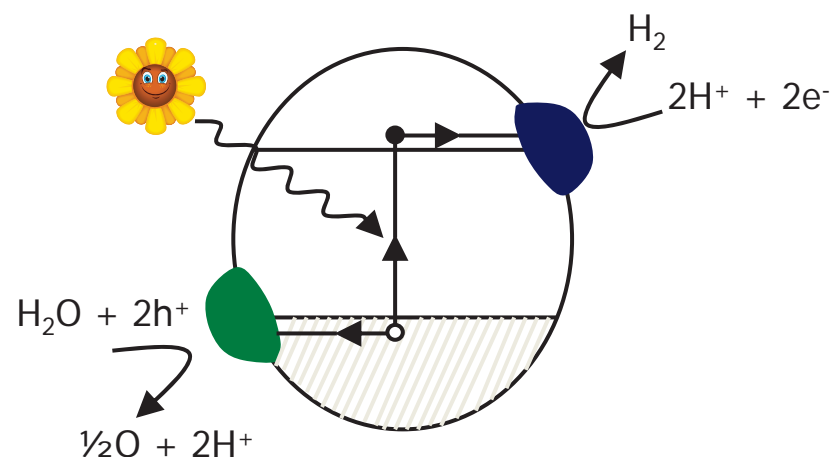


Photoelectrochemical cell



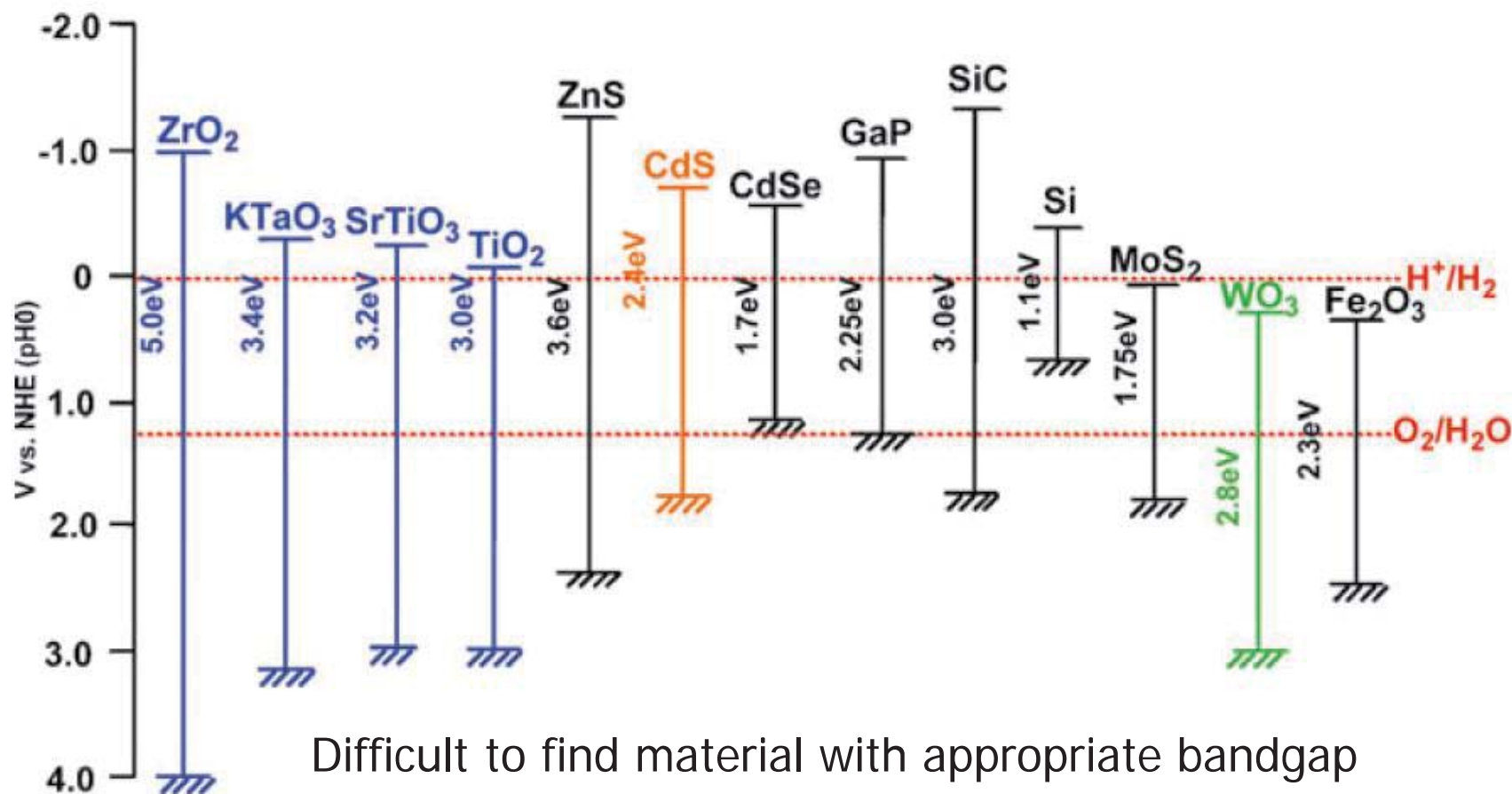
Materials for water splitting

- ❑ Chemical/structural stability
- ❑ Band gap of 1.5-3 eV (overpotentials, quasi Fermi levels, losses)
- ❑ Band edge positions straddle the water redox potentials
- ❑ Good electron/hole mobilities
- ❑ Low cost, abundant, non-toxic
- ❑ Good catalytic properties (co-catalysts)



I. E. Castelli, T. Olsen, S. Datta, D. D. Landis, S. Dahl, K. S. Thygesen, and K. W. Jacobsen, *Energy & Environmental Science*, **5**, 5814 (2012)
I.E. Castelli, D.D. Landis, K.S. Thygesen, S. Dahl, I. Chorkendorff, T.F. Jaramillo, and K.W. Jacobsen, *Energy & Environmental Science*, **5**, 9034 (2012).

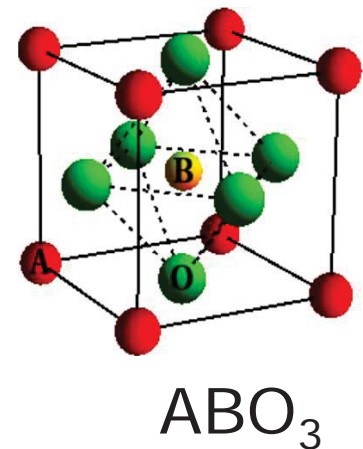
Possible semi-conductors



Difficult to find material with appropriate bandgap and band edge positions !

- [illegible]

- Non Metals
- Radioactive/toxic



Density functional theory + friends



GPAW – projector augmented wave method in real space +



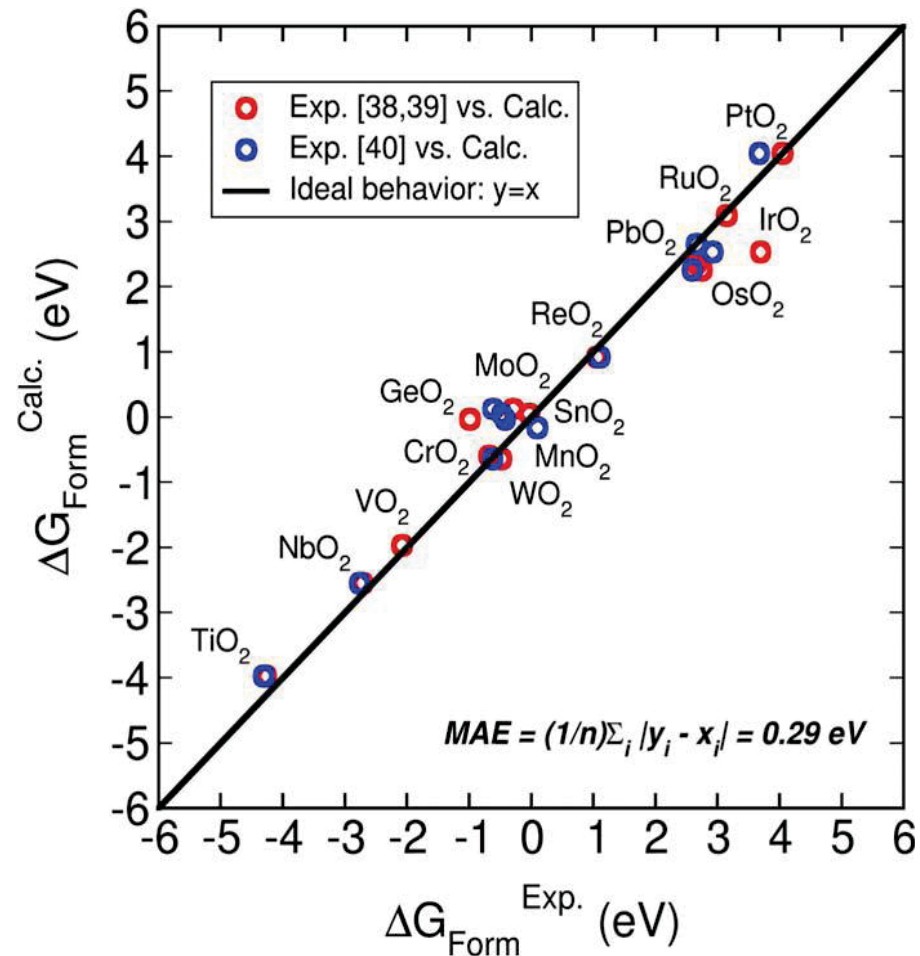
J. Enkovaara *et al.* J. Phys.:Cond. Mat. **22** (2010) ← **Review article**

<https://wiki.fysik.dtu.dk/gpaw/> ← **Free download, GPL**

- ☐ High accuracy: Wave functions expanded on real space grids or plane waves
- ☐ High efficiency: Wave functions expanded in atomic-like orbitals (LCAO)
- ☐ Efficient parallelization (good scalability up to > 32.000 CPUs)
- ☐ Xc-functionals: LDA, GGAs, meta-GGA, LDA+U, EXX, vdWDF, GLLB, BEEF
- ☐ Time-dependent DFT (linear response+time propagation)
- ☐ Many-body perturbation theory (GW and Bethe-Salpeter equation)
- ☐ Phonons and electron-phonon coupling
- ☐ Coherent quantum electron transport
- ☐ QM/MM
- ☐ Atomic Simulation Environment (ASE) python scripting interface

Predicting stability of oxides – Heat of formation

- Oxides are naturally stable towards oxidation!
- DFT-RPBE calculated formation energy for rutile dioxides.
- Similar results obtained for perovskite structures.



Stability analysis

Pool of reference systems:

- ❑ Single metal bulk: $A(s)$ and $B(s)$
 - ❑ Single metal oxides: $A_xO_y(s)$ (and nitrides, sulfides, ...)
 - ❑ Bimetallic oxides $A_xB_yO_z(s)$
 - ❑ Composition and structure available experimentally
 - ❑ Energy calculated from DFT
 - ❑ Dissolution of metal atoms and reactions with water
- } Obtained from ICSD

Formation energy (in practice more references included):

$$\Delta E = ABO_3(s) - \min_{c_i} (c_1 A(s) + c_2 B(s) + c_3 A_xO_y(s) + c_4 B_xO_y(s) + c_5 O)$$
$$c_1 + c_3 = 1, \quad c_2 + c_4 = 1, \quad c_3 + c_4 + c_5 = 3$$

→ Solved by linear programming.

Bandgap calculations with GLLB-SC

The GLLB xc-functional (Gritsenko, van Leeuwen, van Lenthe and Baerends):

$$E_g^{QP} = E_g^{KS} + \Delta_{xc}$$

Derivative discontinuity

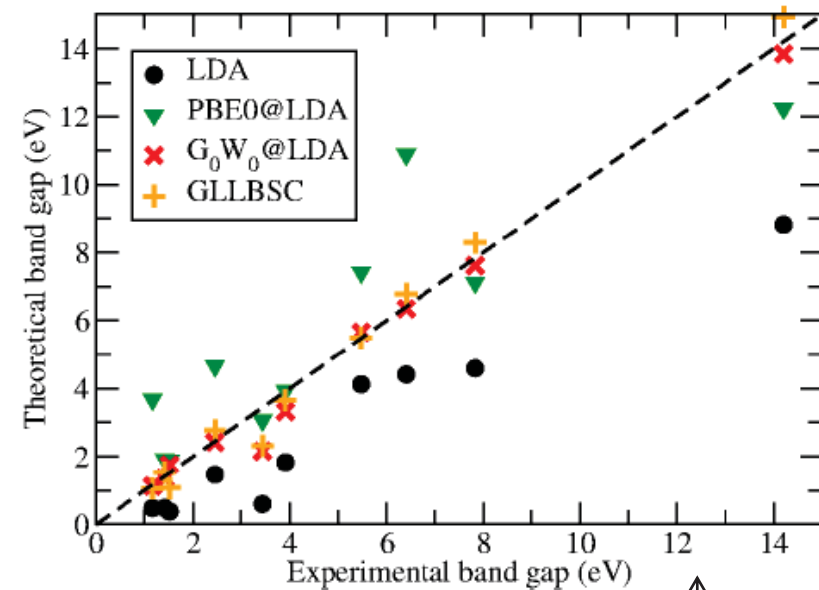
Screening + response

$$v_x(\mathbf{r}) = v_S(\mathbf{r}) + v_{\text{resp}}(\mathbf{r})$$

$$v_S(\mathbf{r}) = \frac{2\epsilon_x^{\text{GGA}}(\mathbf{r}; n)}{n(\mathbf{r})}$$

$$v_{\text{resp}}(\mathbf{r}) = \sum_i^{\text{occ}} K[n] \sqrt{\epsilon_r - \epsilon_i} \frac{|\psi_i(\mathbf{r})|^2}{n(\mathbf{r})}$$

$$\Delta_{x,\text{resp}}(\mathbf{r}) = \sum_i^N K(\sqrt{\epsilon_{N+1} - \epsilon_i} - \sqrt{\epsilon_N - \epsilon_i}) \frac{|\psi_i(\mathbf{r})|^2}{n(\mathbf{r})}$$



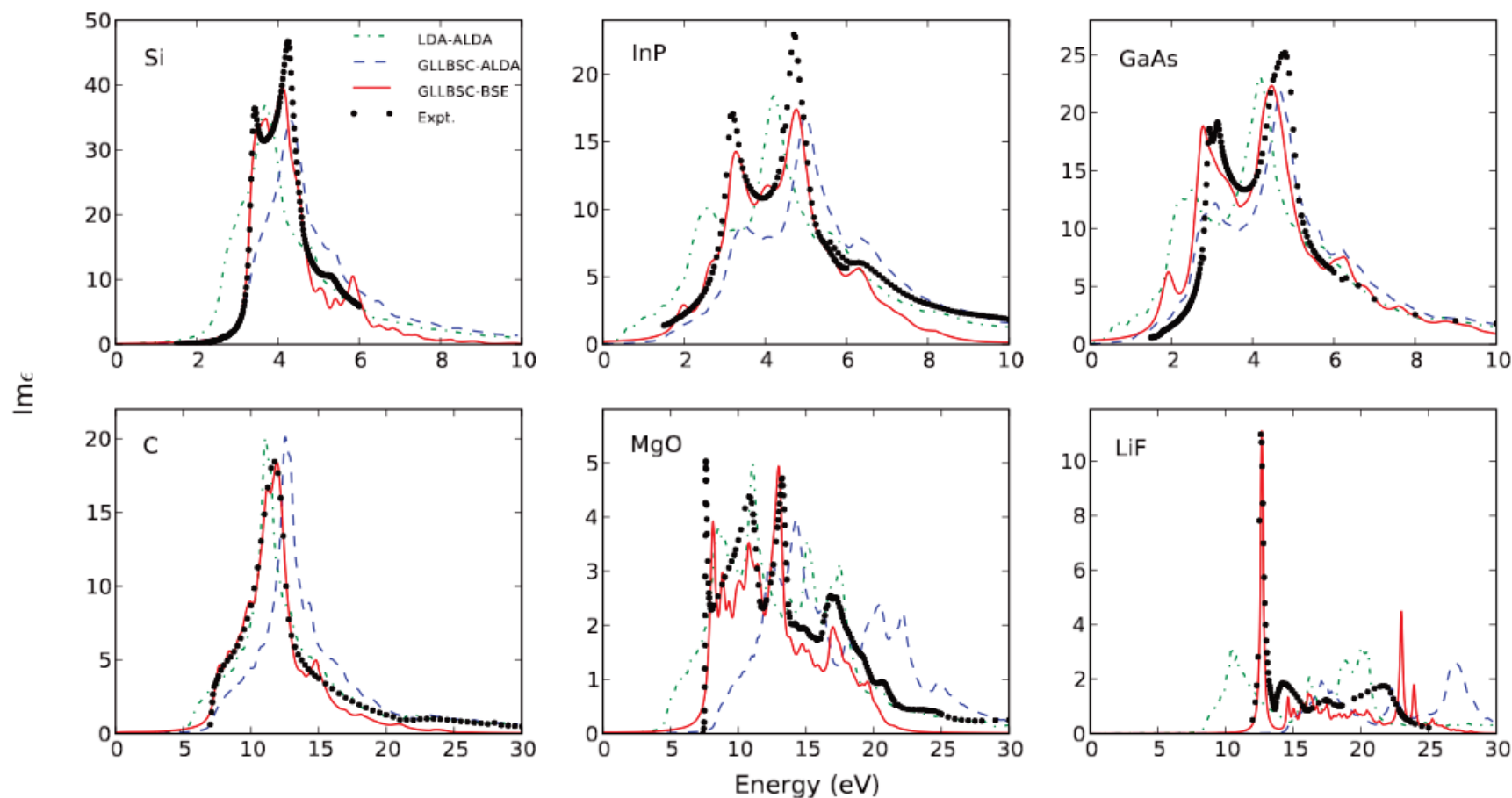
(GPAW calculations by Falco Hüser)

GLLBSC: Screening exchange-correlation from PBEsol

First description: Gritsenko *et al.*, *Phys. Rev. A* **51**, 1944 (1995).

Implemented in GPAW: Kuisma *et al.*, *Phys. Rev. B* **82**, 115106 (2010).

Optical absorption spectra with GLLBSC-BSE



Derivative discontinuity used in single-particle energies, but not for W in the BSE.

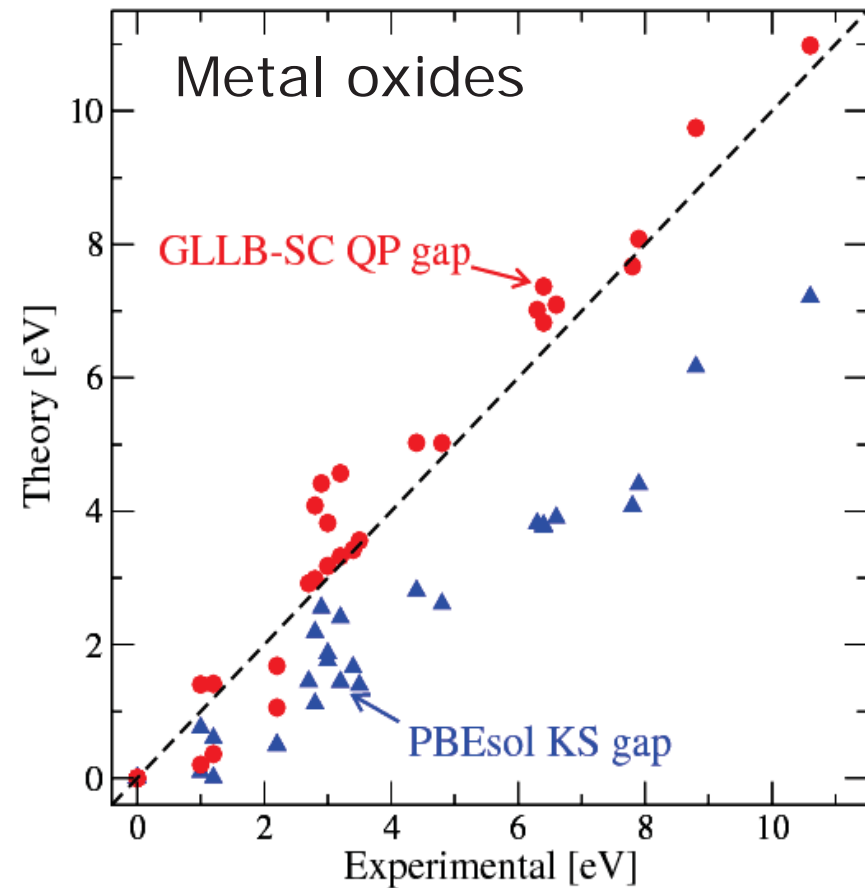
Predicting bandgaps of oxides with GLLBSC

The GLLB-SC xc-functional:

$$E_g^{QP} = E_g^{KS} + \Delta_{xc}$$

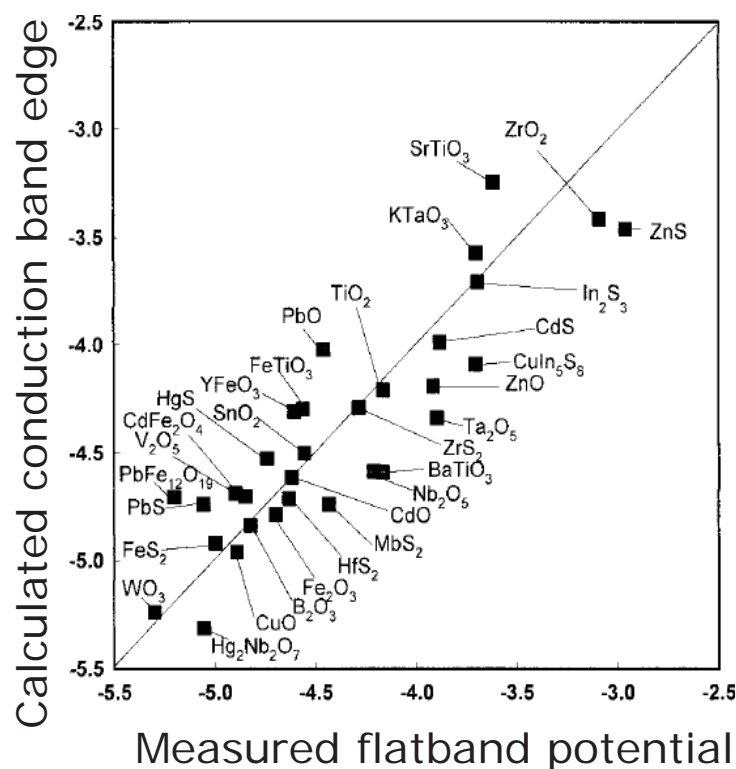
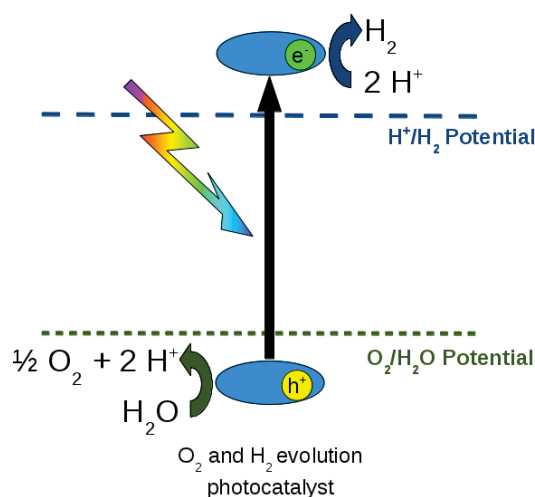
Derivative discontinuity

- ❑ Bandgaps within ~0.5 eV of exp.
- ❑ Minimal computational cost
- ❑ Neglect of electron-hole interaction



Band edge positions

Empirical formula: $E_C = (\chi_A \chi_B \chi_O^3)^{1/5} - 1/2 E_{gap} + E_0$

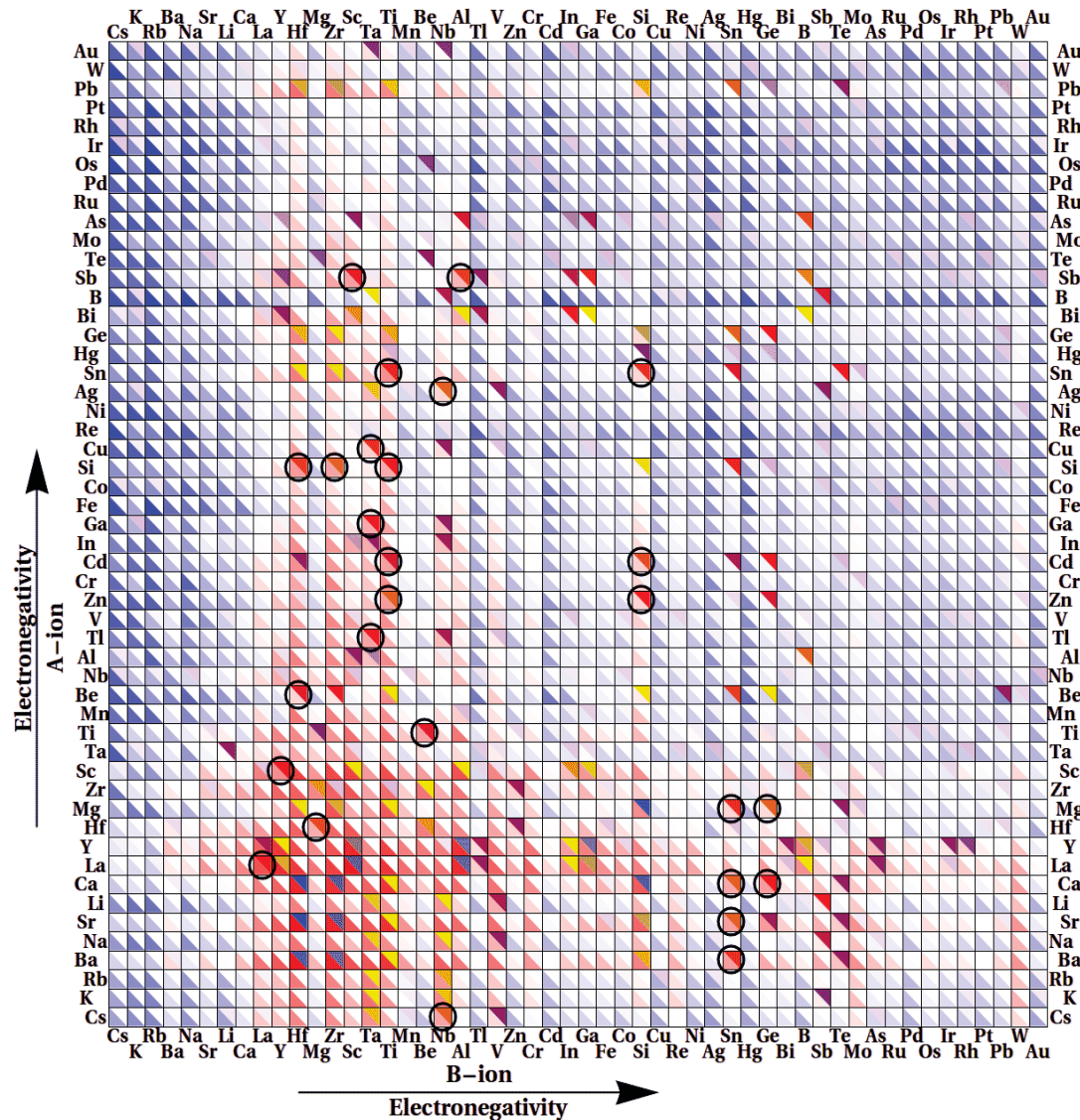


$\chi = (A + I)/2$
 (Absolute electronegativity)
 A: Electron affinity
 I: Ionization potential
 E_{gap} : Band gap
 $E_0 = -4.5$ eV
 (NHE relative to vacuum)

M. A. Butler and D. S. Ginley, Journal of The Electrochemical Society (1978)

Y Xu and MAA Schoonen, American Mineralogist (2000)

Cubic perovskites: ABO_3



Stability:

Formation energy < 0.2 eV

Light absorption:

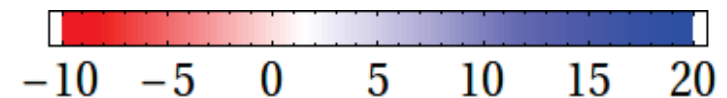
1.5 eV < band gap < 3 eV

13 oxides

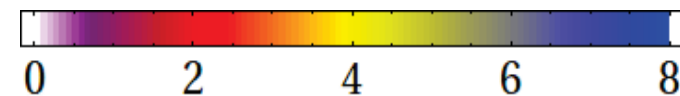


(Level alignment)

10 oxides



Heat of Formation (eV)



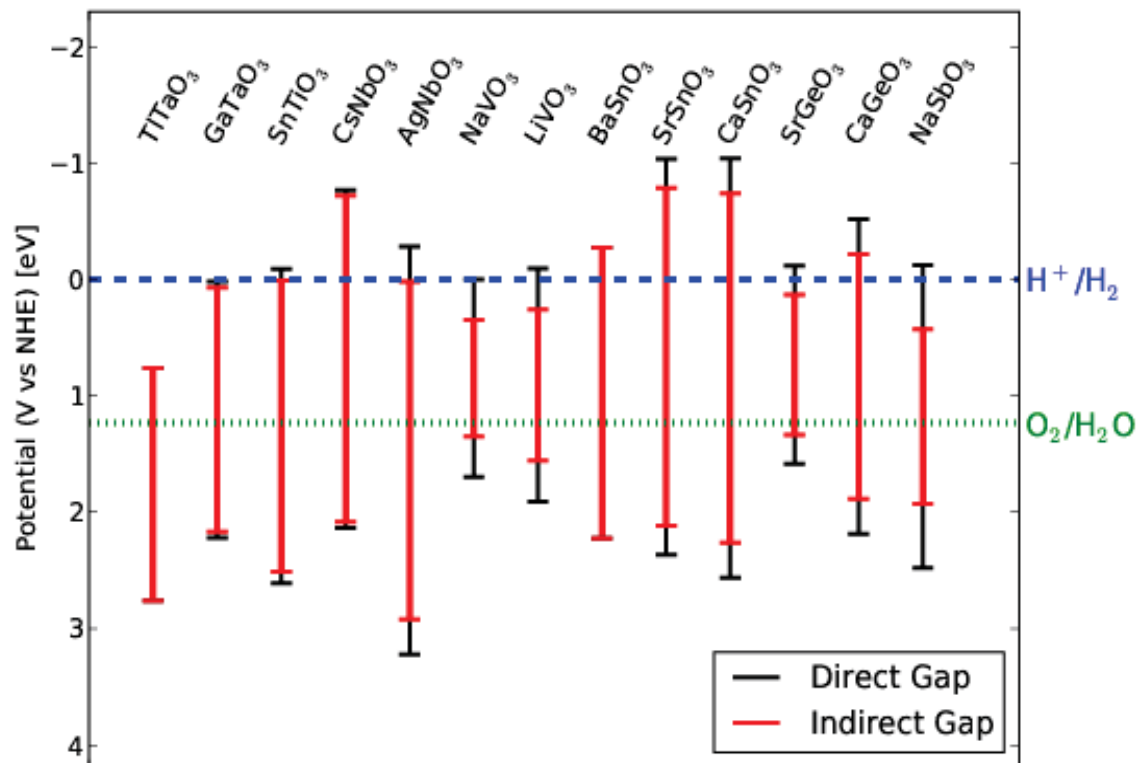
Energy Gap (eV)

One-photon water splitting – oxide candidates

Empirical formula for the conduction band relative to NHE:

Butler and Ginley (1978)

$$E_C = (\chi_A \chi_B \chi_O^3)^{1/5} - 1/2 E_{gap} + E_0$$



AgNbO₃ and **BaSnO₃** known.

AgNbO₃ works!

BaSnO₃ defect-induced recombination

SrSnO₃ and **CaSnO₃**:

known in orthorhombic perovskite

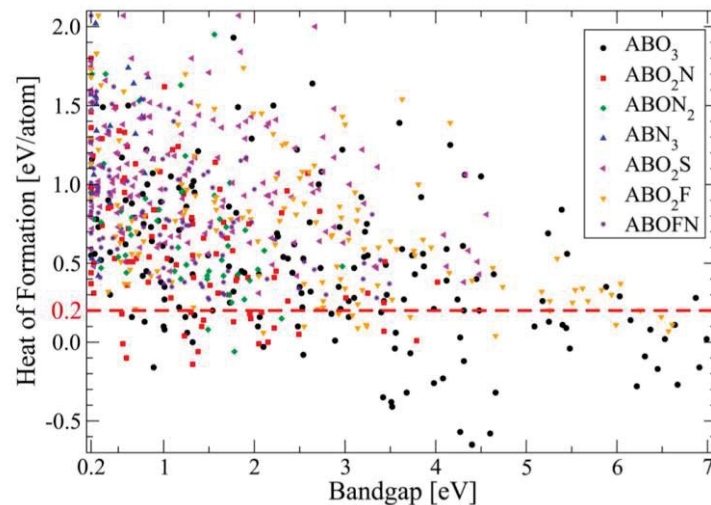
→ too large gaps

Oxides, oxynitrides, oxysulfides, oxyfluorides, oxyfluornitrides

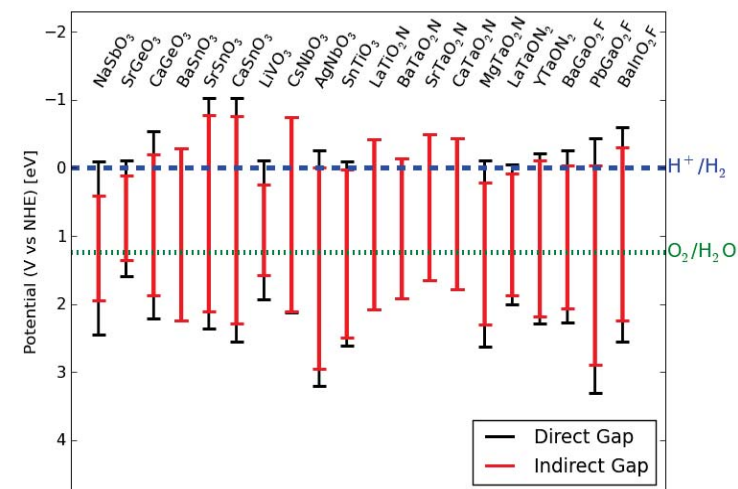
Materials candidates:

- ABO_3 : 10
- ABO_2N : 5 BaTaO₂N, SrTaO₂N, CaTaO₂N, LaTiO₂N (known)
MgTaO₂N (unknown)
- $ABON_2$: 2 LaTaON₂ (known)
YTaN₂ (unknown)
- ABN_3 : 0
- ABO_2S : 0
- ABO_2F : 3
- ABO_2FN : 0

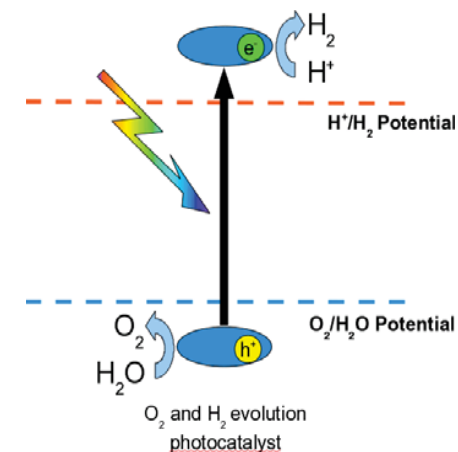
~19000 materials



20 candidate materials



One-photon water splitting



Project specific interface: Light absorbing materials for water splitting



Computational Materials Repository

[Hide search box](#)

Do not forget to press **update matrix** after changing the selection!
If there is an error - it means that the dataset is already being calculated! Please wait a moments and try again.

Chose a data set: ABO3 (2704)

Width: 800

Height: 1200

X axis ticks: B

Y axis ticks: automatically selected

X sort order: Electronegativity (Paulin)

Y sort order: Electronegativity (Paulin)

Action on Click: show band edges

References:
☒ ABN (3)
☒ ABO (20)
☒ AN (50)
☒ AO (52)
☒ AON (35)
☒ default (3)
☒ mbulk (52)

	Value field:	Colors:
Triangle 1: (top-right)	gllbsc_ind-gap (eV)	0->white,0.7->purple,2.2->red
Triangle 2: (bottom-left)	heat_of_formation (eV)	min->red,0.3->white,4->blue
Triangle 3:		
Triangle 4:		

Examples for the **color** choice:

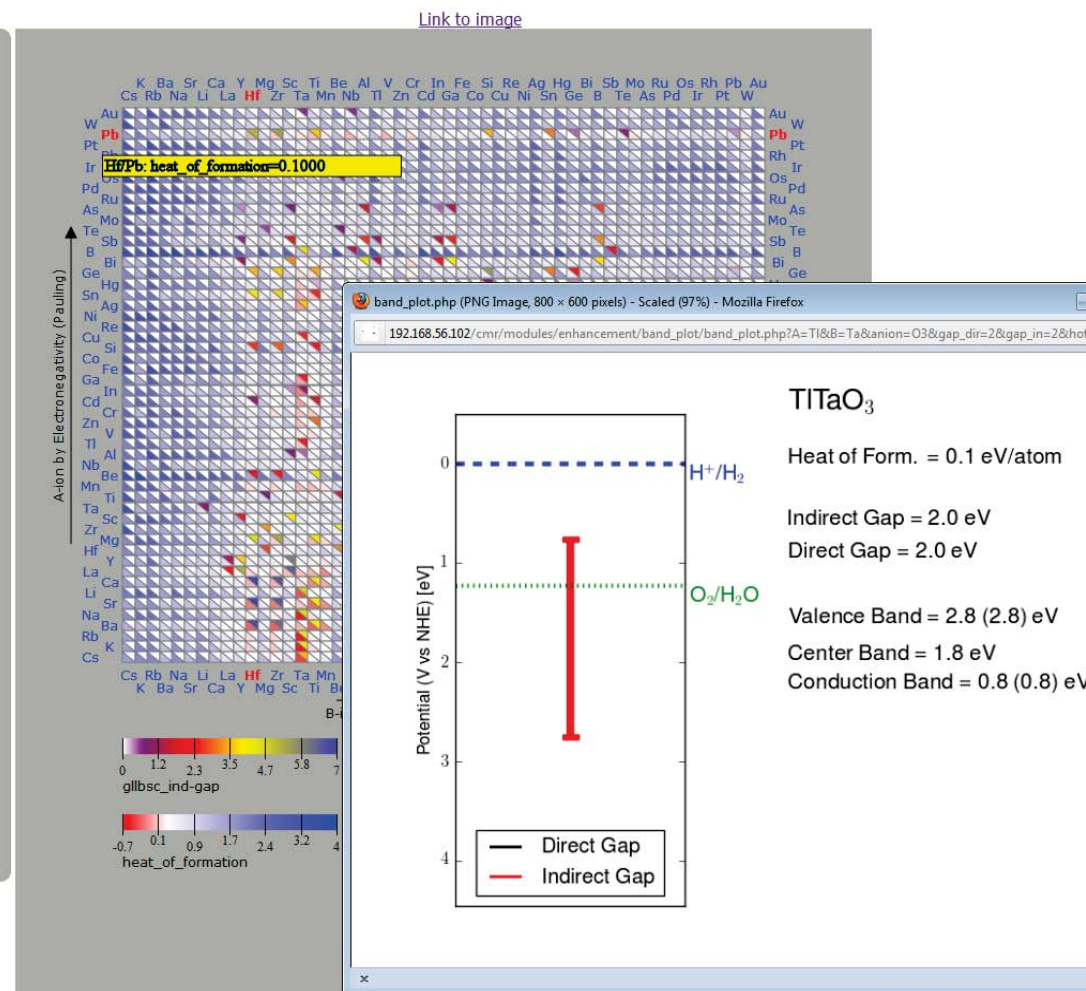
0->white,1->red,7->blue

0->white,0.9->red,2.2->green,4->yellow,8->blue

-100->blue,100->red

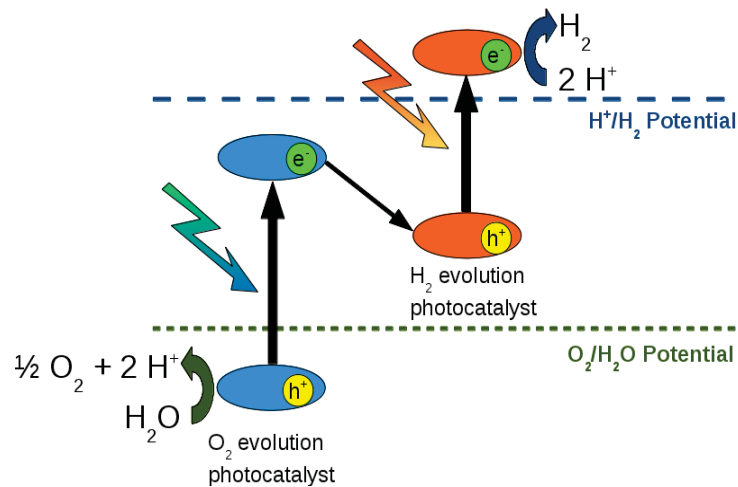
Valid color names are black, blue, cyan, green, gray, green, lightblue, pink, red, purple, white, yellow. Please note that the values must be in **increasing** order.

[Update matrix](#)



<http://cmr.fysik.dtu.dk>

Tandem cell water splitting: Screening for anode materials

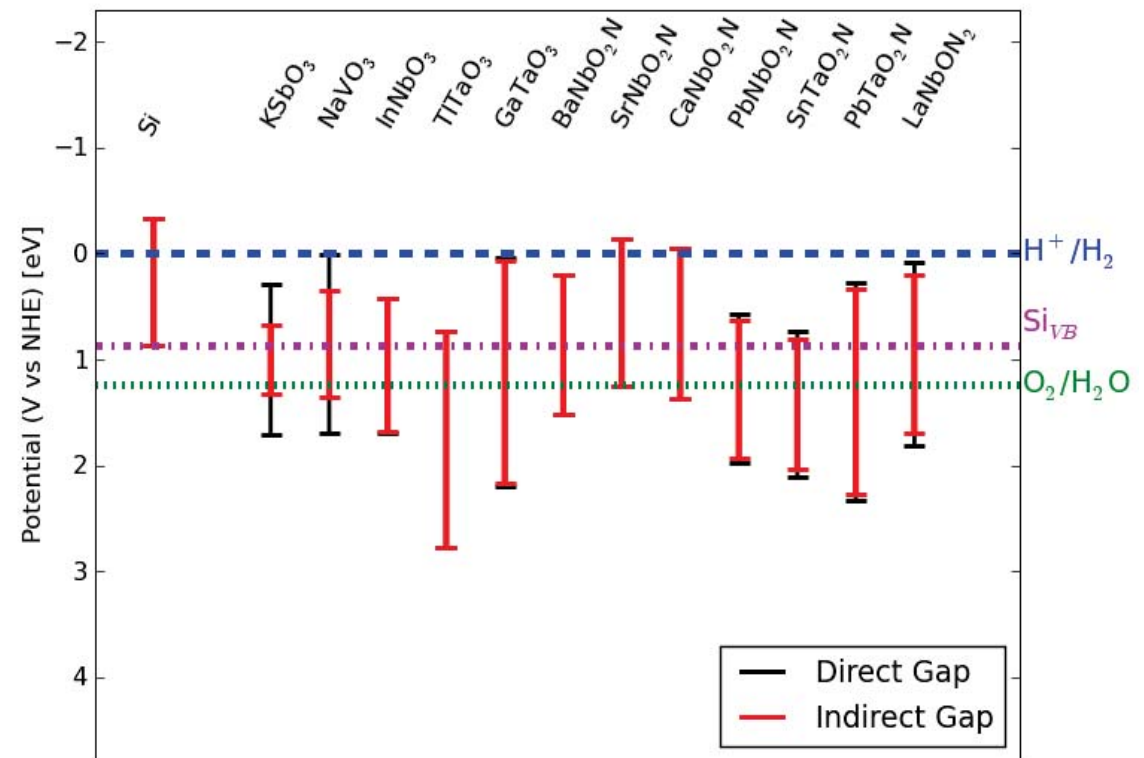


12 candidates

Selection criteria for anode material:

Stability: $E_{\text{form}} < 0.2$

Band gap: $1.3 < E_{\text{gap}} < 3$ eV



I.E. Castelli, D.D. Landis, K.S. Thygesen, S. Dahl, I. Chorkendorff, T.F. Jaramillo, K.W. Jacobsen, *EES*, **5**, 9034 (2012).

Next: Layered perovskites + ICSD

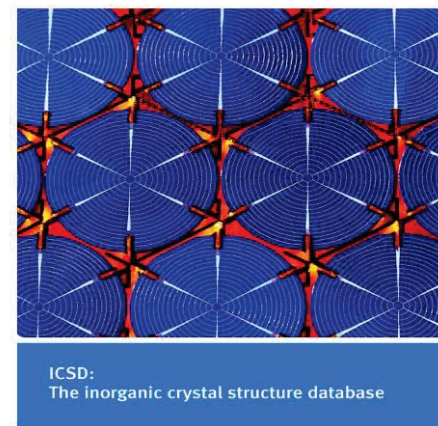
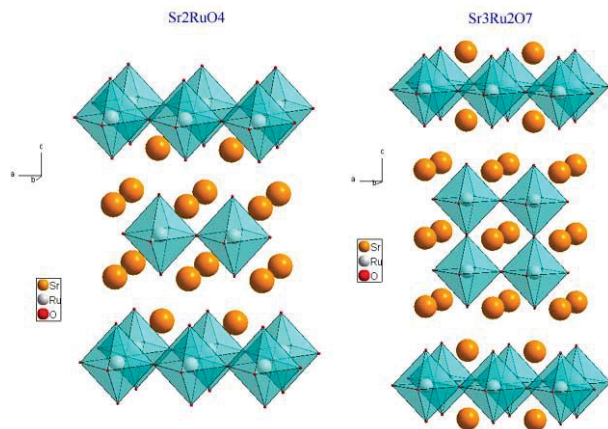
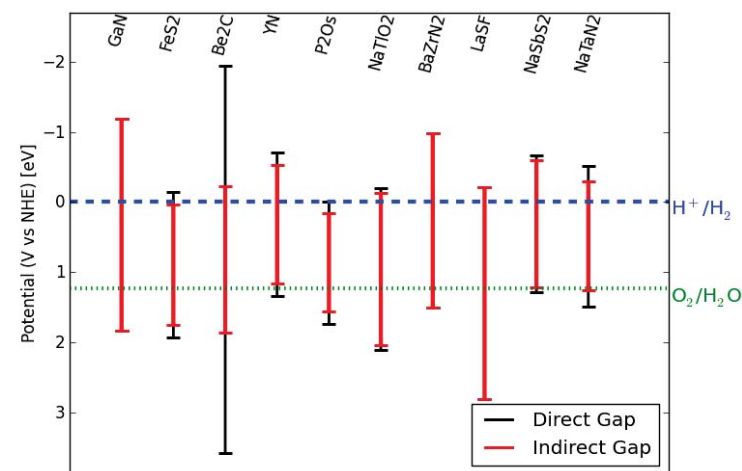
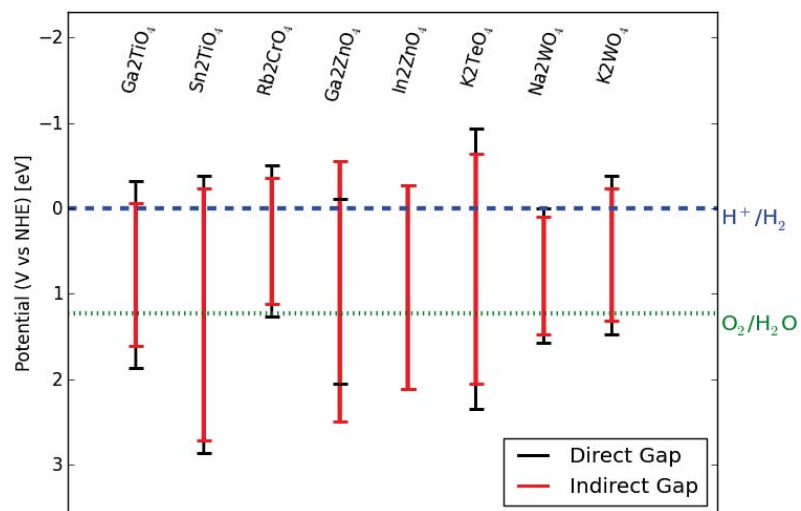


Figure from
Cava lab,
Princeton

Preliminary screenings:



Collaboration with the **Materials Project**,
Anubhav Jain, Kristin Persson, Gerbrand Ceder,
GLLB band gaps for pre-optimized structures

Total energies from the ACFDT

The **adiabatic connection and fluctuation-dissipation theorem**:

$$E_c = -\frac{1}{2\pi} \int_0^1 d\lambda \int_0^\infty d\omega \text{Tr} [v\chi^\lambda(i\omega) - v\chi^0(i\omega)]$$

Density response function from TDDFT:

Kohn-Sham
response function

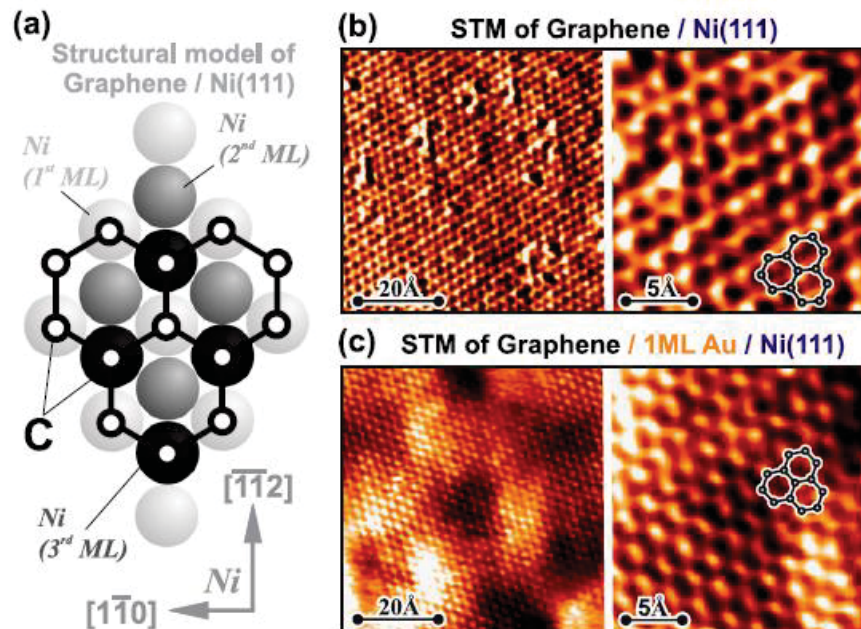
$$\chi^\lambda(\omega) = \chi^0(\omega) + \chi^0(\omega)[\lambda v + f_{xc}^\lambda(\omega)]\chi^\lambda(\omega)$$

With the RPA one obtains (λ -dependence integrated analytically):

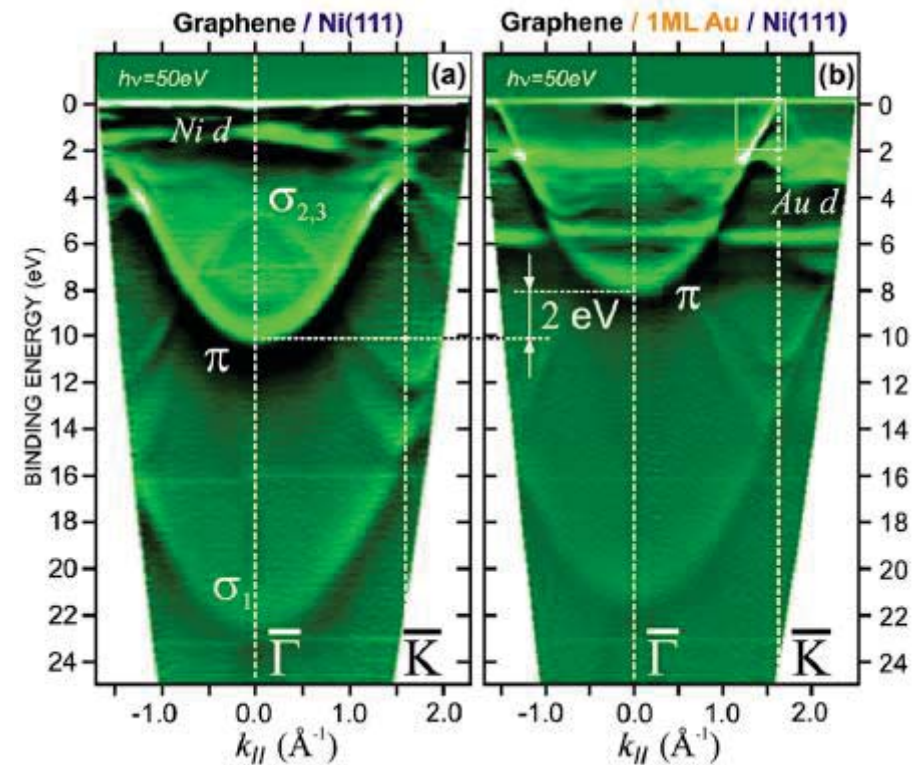
$$E_c^{RPA} = \int_0^\infty \frac{d\omega}{2\pi} \text{Tr} [\ln(1 - v\chi^0(i\omega)) + v\chi^0(i\omega)]$$

→ Implemented in GPAW with plane wave basis.

Graphene on metals: A prototypical metal/organic interface



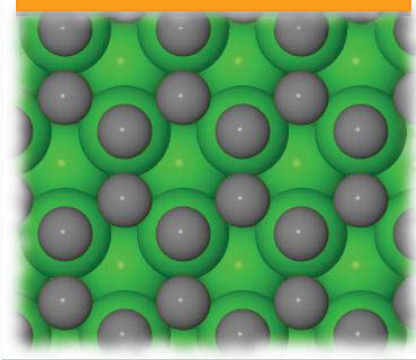
Varykhalov *et al.* PRL 101, 157601 (2008)



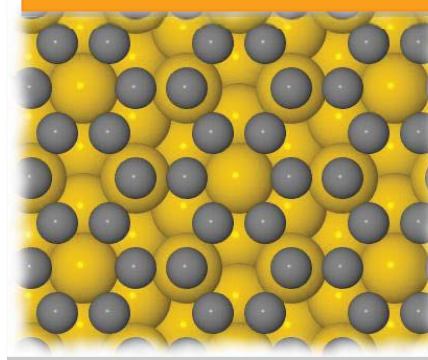
- ❑ Graphene is strongly bound on Ni(111) (hybridization opens band gap)
- ❑ Intercalation of a monolayer Au restores the Dirac cone
- ❑ Weak physisorption found for Pt(111), Ag(111), Cu(111), Au(111)
- ❑ Strong chemisorption found for Ni(111), Co(0001), Pd(111)

Graphene on metals: A challenge for DFT

Structure for Co, Ni and Cu



Structure for Pd, Ag, Au, Pt and Al

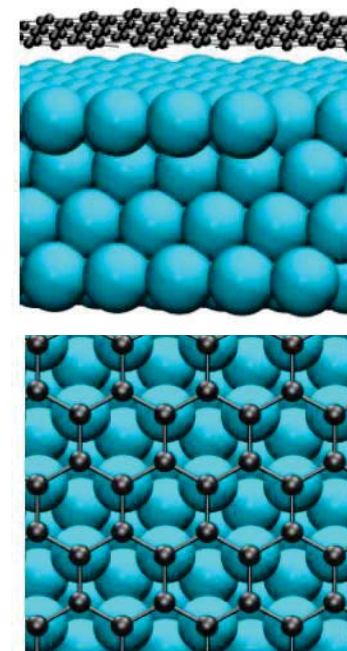
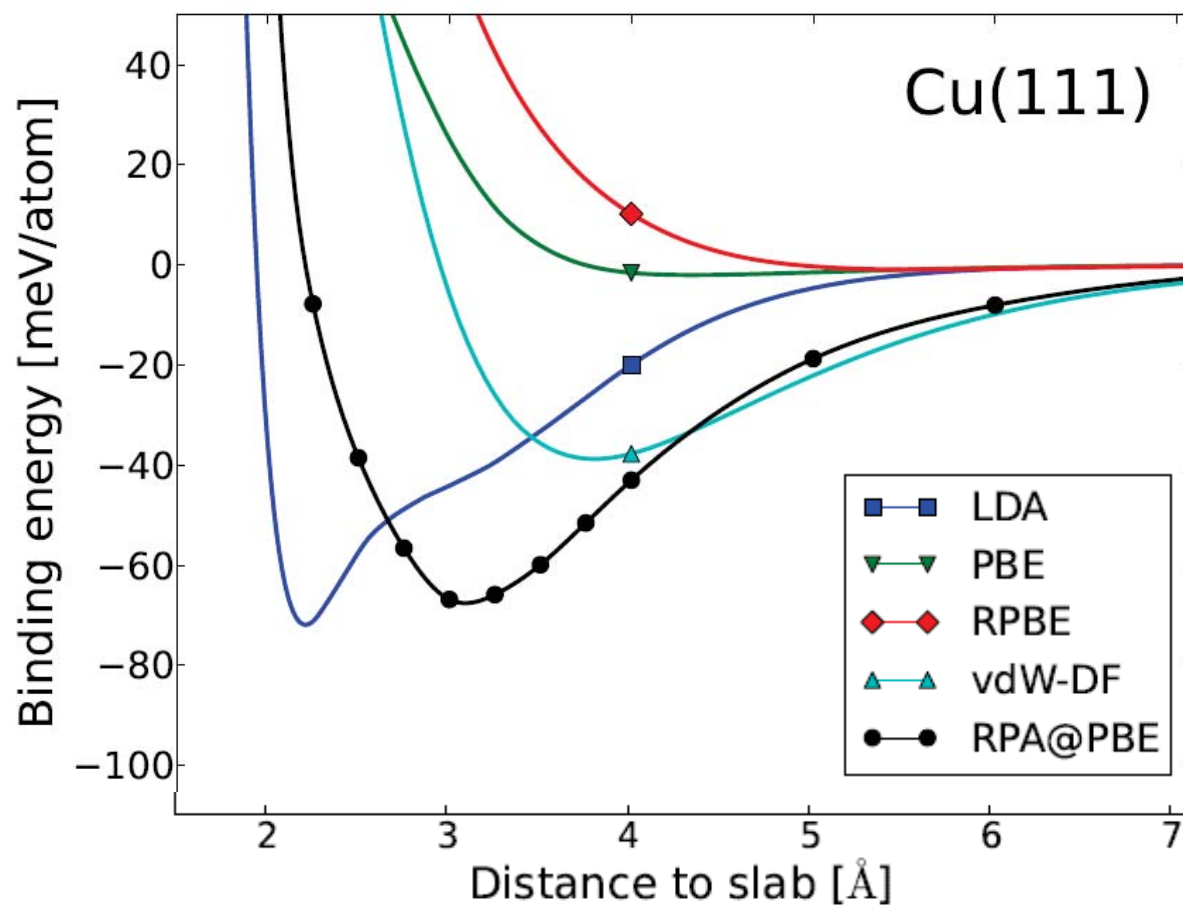


		Co	Ni	Pd	Ag	Au	Cu	Pt	Al
vdW-DF	d (Å)	3.40	3.50	3.50	3.55	3.57	3.58	3.67	3.72
	E_b (meV)	30	37	39	33	38	38	43	35
LDA	d (Å)	2.08	2.08	2.33	3.32	3.35	3.21	3.25	3.46
	E_b (meV)	175	123	79	45	31	35	33	25
Exp.	d (Å)	1.5-2.2	2.1	-	-	5	-	3.3	-
	Hybridization	strong	strong	strong	weak	weak	weak	weak	-

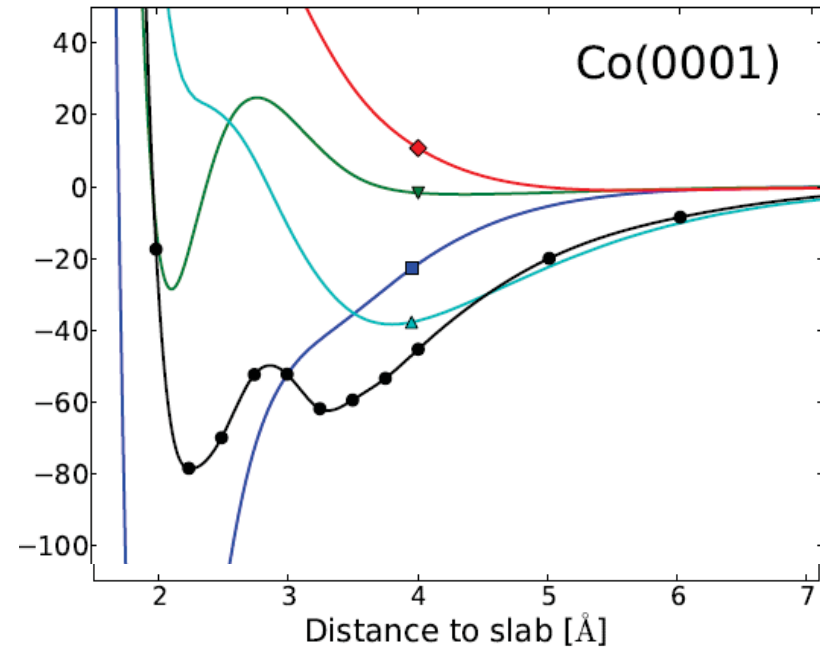
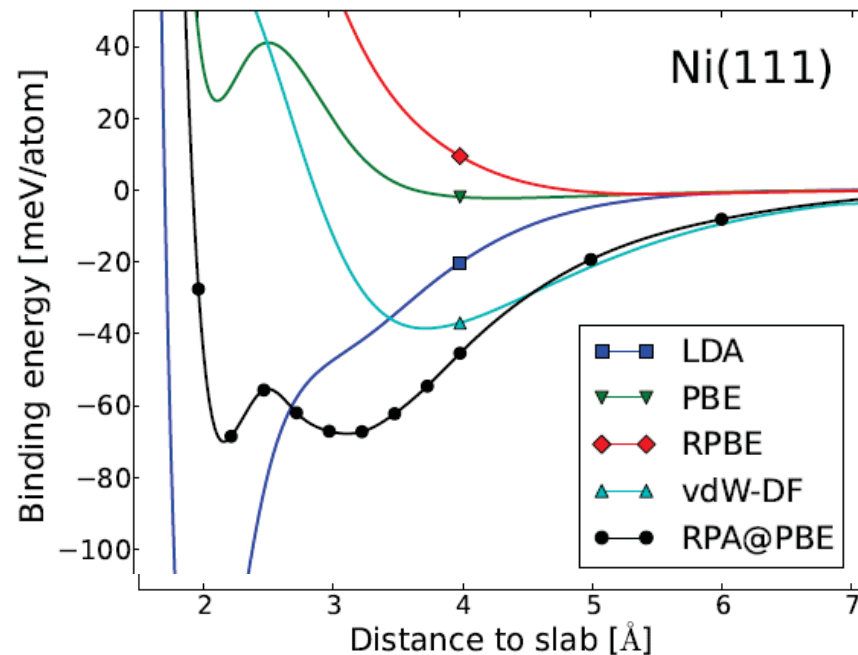
G. Giovannetti, P. A. Khomyakov, G. Brocks, V. M. Karpan, van den Brink, P. J. Kelly, PRL **101**, 026803 (2008)

M. Vanin, J.J. Mortensen, A.K. Kelkkanen, J.M. Garcia-Lastra, K.S. Thygesen, K.W. Jacobsen, PRB **81**, 081408 (2010)

Potential energy surfaces of graphene@Cu(111)



Covalent vs. dispersion interaction



- ❑ vdW-DF accounts well for dispersive interactions, but misses covalent binding
- ❑ RPA seems to capture both effects

Towards chemical accuracy

- ❑ RPA gives proper description of long-range correlation, but...
- ❑ RPA severely underestimates absolute correlation energies
- ❑ RPA underestimates covalent bonds
- ❑ This could be improved by inclusion of an xc kernel

For the adiabatic LDA (ALDA) one has

$$f_x^\lambda = \lambda f_x$$

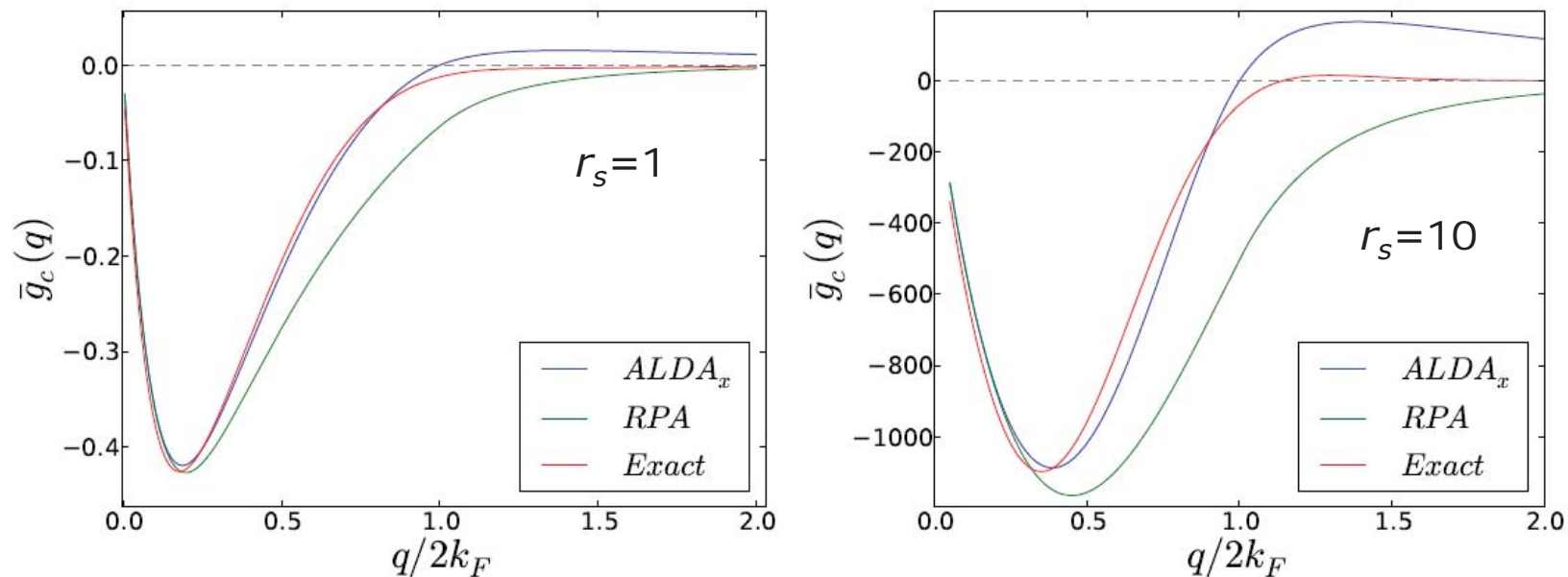
The coupling constant integration can then be performed to yield

$$E_c^{ALDA-X} = \int_0^\infty \frac{d\omega}{2\pi} \text{Tr} \left[\chi^0(i\omega) v \left(\chi^0(i\omega) f_x \right)^{-1} \ln \left(1 - \chi^0(i\omega) f_x \right) + v \chi^0(i\omega) \right]$$

But... ALDA does not improve RPA (overbinds) and suffers from convergence problems [Furche and Voorhis JCP **122**, 164106 (2005)].

The renormalized ALDA kernel (rALDA)

Coupling constant averaged correlation hole of the uniform gas:

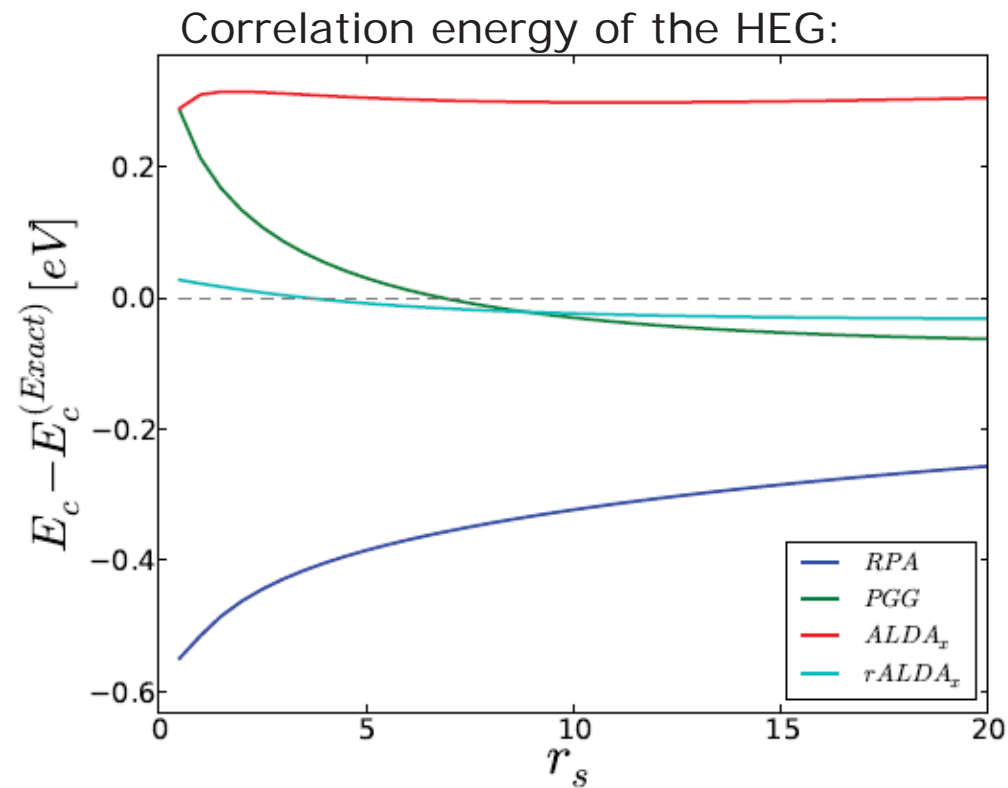


- ❑ RPA (ALDA) underestimate (overestimates) correlation energies
- ❑ For $q < 2k_F$ the ALDA kernel is close to the exact result

Renormalized ALDA kernel: $f_{Hxc}^{rALDA}[n](q) = \theta(2k_F - q) f_{Hxc}^{ALDA}[n]$

Correlation energy of HEG

Renormalized ALDA kernel: $f_{Hxc}^{rALDA}[n](q) = \theta(2k_F - q) f_{Hxc}^{ALDA}[n]$



rALDA for inhomogeneous systems

Renormalized ALDA kernel: $f_{Hxc}^{rALDA}[n](q) = \theta(2k_F - q) f_{Hxc}^{ALDA}[n]$

For inhomogeneous systems we replace:

$$r \rightarrow |r - r'|, \quad k_F \rightarrow [3\pi^2 \tilde{n}(r, r')]^{1/3}, \quad \tilde{n}(r, r') = [n(r) + n(r')] / 2$$

Atomization energies (kcal/mol):

	LDA	PBE	RPA@LDA	RPA@PBE	ALDA	rALDA	Exp.
H ₂	-113	-105	-109	-109 (109)	-110	-107	-109
N ₂	-268	-244	-225	-224 (223)	-229	-226	-228
O ₂	-174	-144	-103	-112 (113)	-155	-118	-120
CO	-299	-269	-234	-242 (244)	-287	-253	-259
F ₂	-78	-53	-13	-30 (30)	-74	-39	-38
HF	-161	-142	-122	-130 (133)	-157	-136	-141
H ₂ O	-266	-234	-218	-222 (223)	-249	-225	-233
MAE	33	10.1	14.9	8.4	19	3.7	

Absolute correlation energies (kcal/mol):

	LDA	PBE	RPA	ALDA _X	rALDA	Exact
H	-14	-4	-13	6	-2	0
H ₂	-59	-27	-51	-16	-28	-26
He	-70	-26	-41	-19	-27	-26

T. Olsen and KST, RRB **86**, 081103(R) (2012)

→ For more about rALDA including results for solids see **Thomas Olsen's** poster.

Conclusions

- ❑ High-throughput screening of >19.000 light-harvesting perovskites for water splitting
 - ❑ Efficient and reliable calculation of band gaps from the GLLB-SC xc-functional + empirical model for band alignment
 - ❑ Future: Extend to other materials and structures (double/layered perovskites) + include experimental data (ICSD)
-
- ❑ Graphene@metals: A challenge for ab-initio theory. RPA indicates a delicate balance between covalent and dispersive interactions
 - ❑ RPA underestimates covalent bonding (local correlation problem)
 - ❑ ALDA does not improve on RPA: xc-hole diverges for $r = 0$!
 - ❑ The renormalized rALDA cures the problems of ALDA and yields very accurate energies for both molecules and solids.

Acknowledgements



CAMD/DTU:

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Jun Yan (now Stanford Univ.)

Falco Hüser

Jens Jørgen Mortensen

Karsten Jacobsen

CINF-CASE/DTU:

Ib Chorkendorff

Søren Dahl (now at Topsøe A/S)

Stanford University:

Tom Jaramillo



CASE

Catalysis for Sustainable Energy

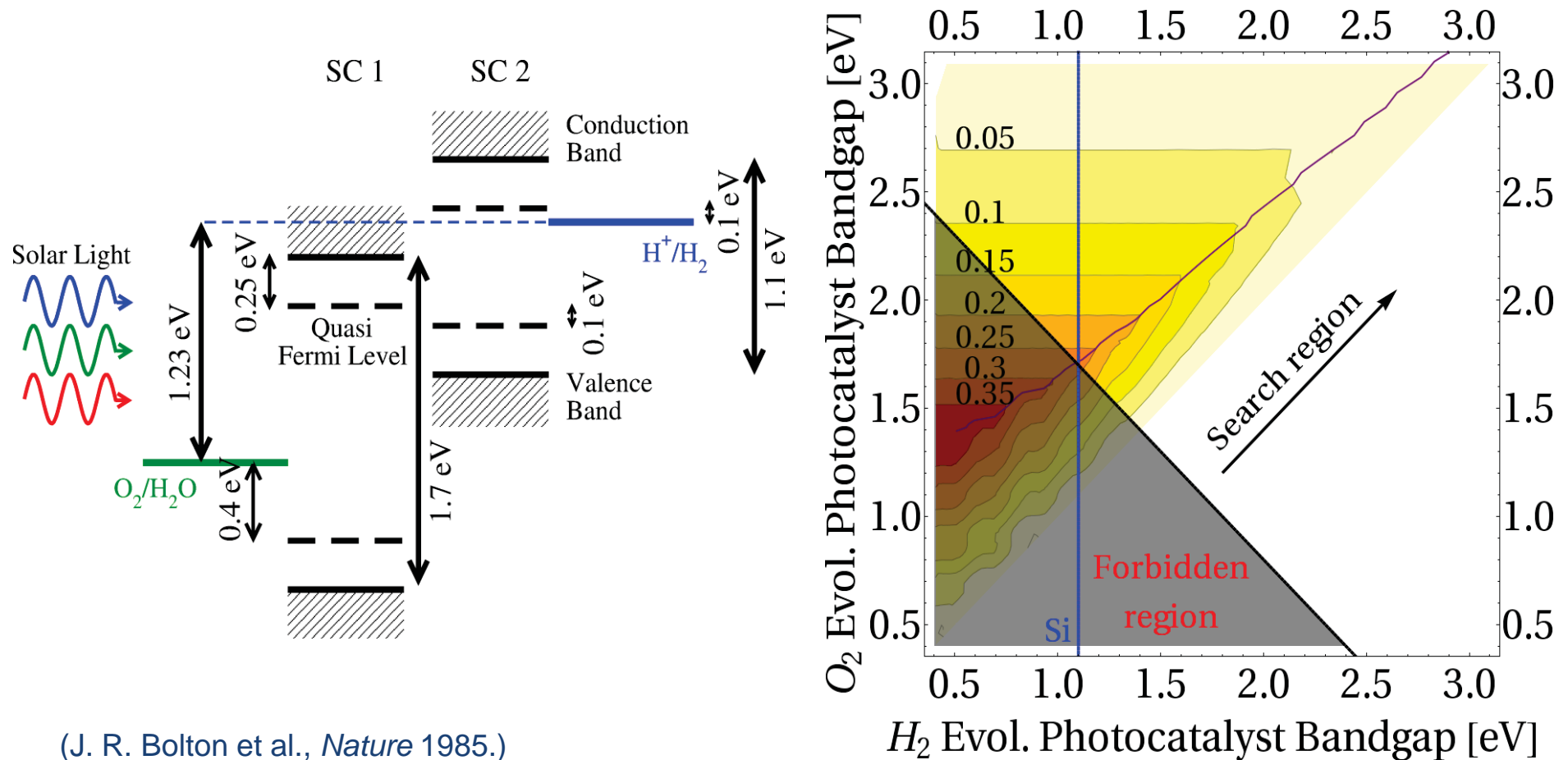


**Danish Agency for Science
Technology and Innovation**

Ministry of Science, Innovation
and Higher Education

Tandem cell efficiency

Solar-to-hydrogen energy conversion efficiency

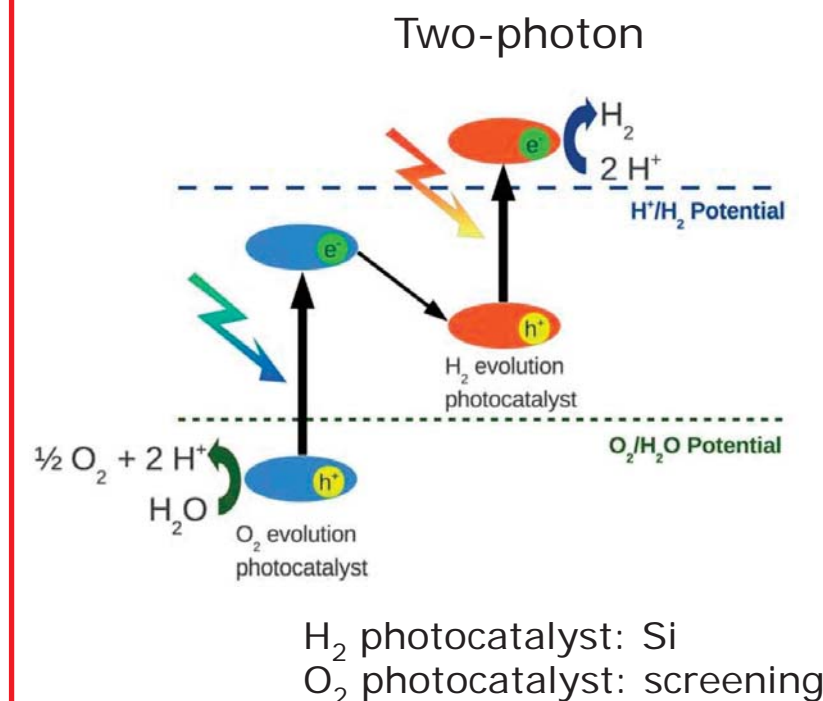
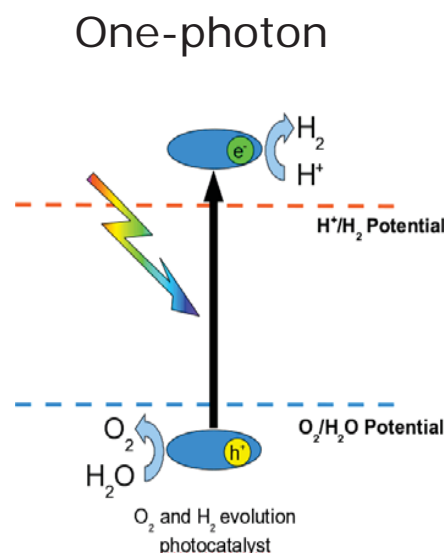


(J. R. Bolton et al., *Nature* 1985.)

(M. G. Walter et al., *Chem Rev* **110**, 6446, 2010)

(I.E. Castelli, D.D. Landis, K.S. Thygesen, S. Dahl, I. Chorkendorff, T.F. Jaramillo, and K.W. Jacobsen, *Energy & Environmental Science*, doi: 10.1039/c2ee22341d)

Design rules for two-photon water splitting



Screening parameters

Chemical/structural stability (ΔE)

Bandgap (E_{gap})

Band edges

(VB_{edge} , CB_{edge})

One-photon WS

$$\Delta E \leq 0.2 \text{ eV}$$

$$1.5 \leq E_{\text{gap}} \leq 3 \text{ eV}$$

$$\text{VB}_{\text{edge}} > 1.23 \text{ eV}$$

$$\text{CB}_{\text{edge}} < 0 \text{ eV}$$

Two-photon WS

$$\Delta E \leq 0.2 \text{ eV}$$

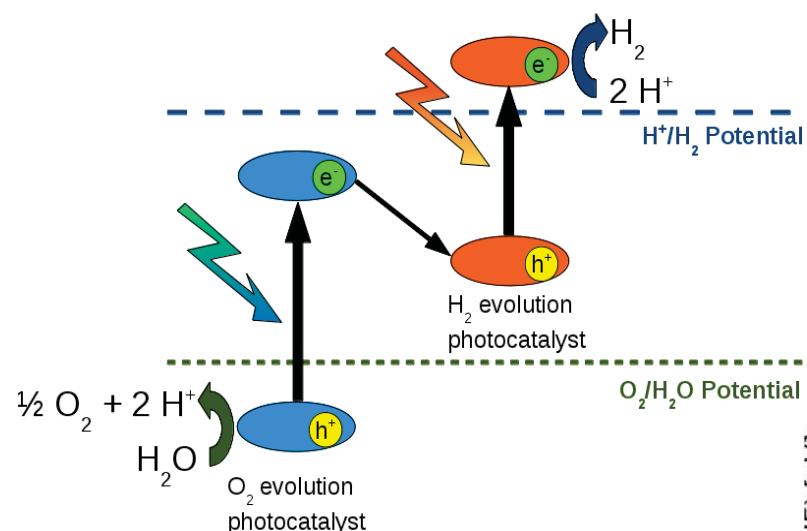
$$1.3 \leq E_{\text{gap}} \leq 3 \text{ eV}$$

$$\text{VB}_{\text{edge}}^{\text{anode}} > 1.23 \text{ eV}$$

$$\text{CB}_{\text{edge}}^{\text{cathode}} < 0 \text{ eV}$$

$$\text{VB}_{\text{edge}}^{\text{cathode}} > \text{CB}_{\text{edge}}^{\text{anode}}$$

Tandem cell water splitting: Screening results

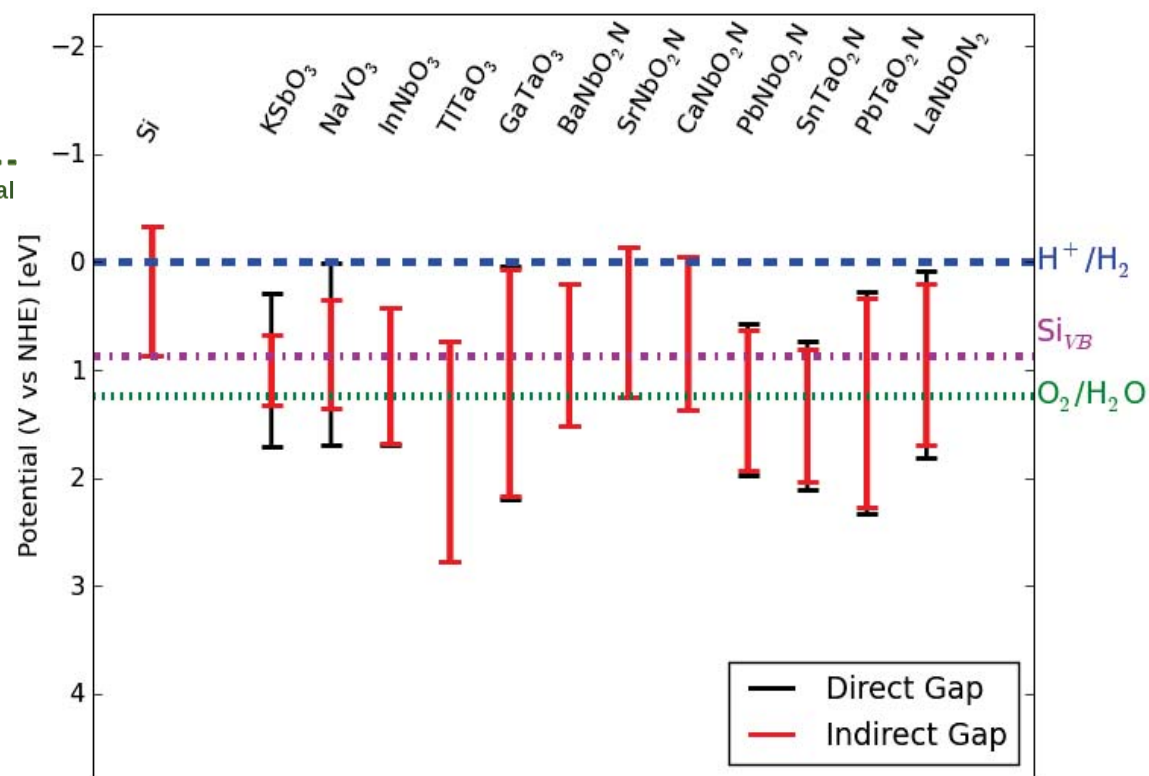


$$E_{\text{form}} < 0.2$$

$$1.3 < E_{\text{gap}} < 3 \text{ eV}$$

12 candidates

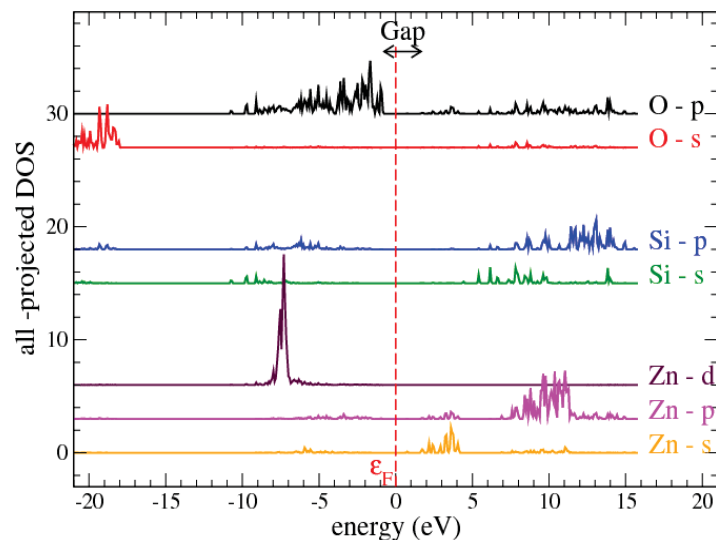
+ 20 from overall WS



I.E. Castelli, D.D. Landis, K.S. Thygesen, S. Dahl, I. Chorkendorff, T.F. Jaramillo, and K.W. Jacobsen, *Energy & Environmental Science*, **5**, 9034 (2012).

LaTiO₂N now under experimental investigation at CINF/CASE/DTU.

Analyzing gap formation



ZnSiO_3

Formation energy = -1 eV;

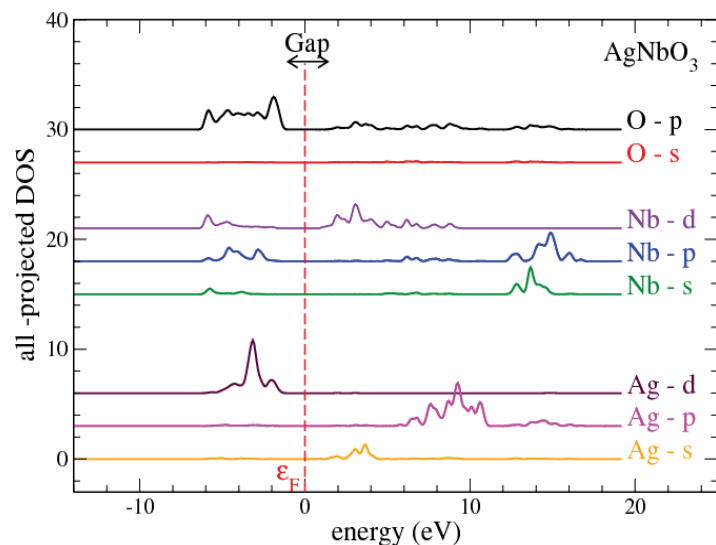
Band gap = 2.4 eV.

Valence band:

O - p orbitals (too deep for water-splitting);

Conduction band:

Zn - s orbitals.



AgNbO_3

Formation energy = -0.6 eV;

Band gap = 3.0 eV.

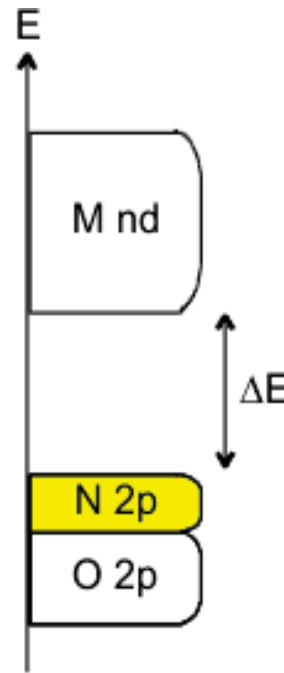
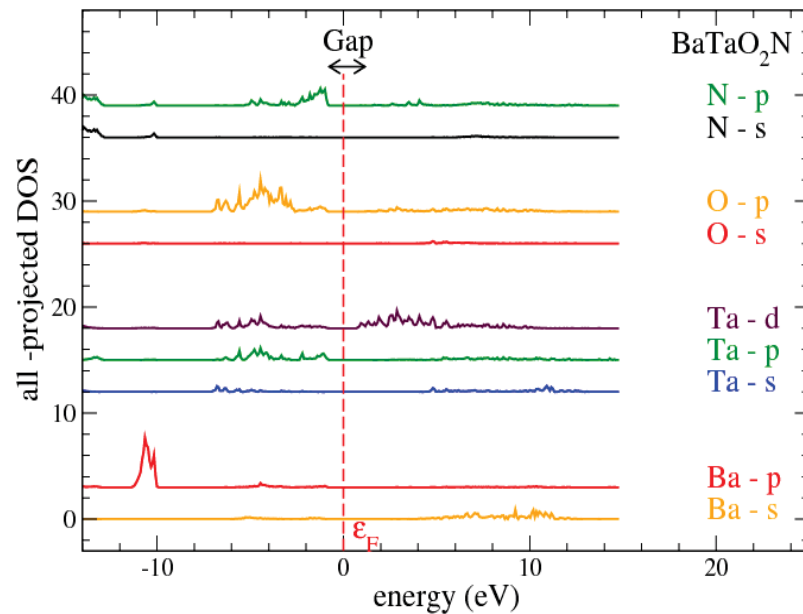
Valence band:

Ag - d and **O - p orbitals**;

Conduction band:

Nb - d orbitals.

Oxynitrides



BaTaO_2N

Formation energy = -6.3 eV;

Band gap = 2.0 eV.

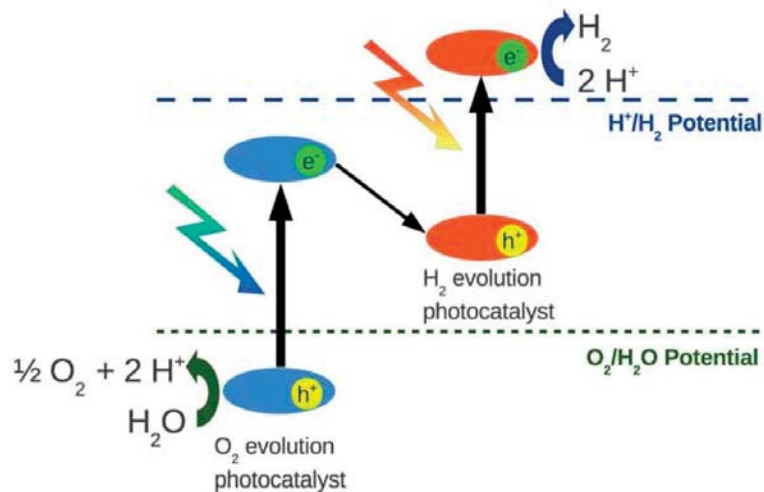
Valence band:

Ta - p and **N - p orbitals**;

Conduction band:

Ta - d orbitals.

Tandem cell principle



Two semiconductors – two photons

- SC 1: Hole for oxygen evolution
- SC 2: Electron for hydrogen evolution

Requirements:

- structural/chemical stability;
- two visible light harvests (optimal gaps: 1.1 eV and 1.7 eV);
- band edges that match with oxygen and hydrogen potentials;
- Small overlap between the semiconductors band edges for the electron transfer reaction.

H_2 photocatalyst: Si

O_2 photocatalyst: screening

Transparent protecting shield – photoanode

