

Data-driven Materials Design and Applications to Two-Dimensional Nano-systems

Rico Friedrich

Institute of Ion Beam Physics and Materials Research, Helmholtz-Zentrum Dresden-Rossendorf
Theoretical Chemistry, Technische Universität Dresden

Predictive Theory

Discovery of Neptune

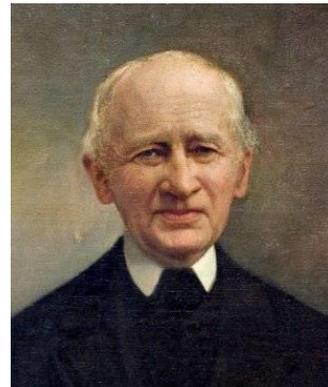


universal law of gravitation

$$\mathbf{F}_1 = \gamma \frac{m_1 m_2}{r_{12}^2} \frac{\mathbf{r}_{12}}{r_{12}} = m_1 \ddot{\mathbf{r}}_1$$



Urbain Le Verrier
(1811-1877)



Johann Gottfried Galle
(1812-1910)

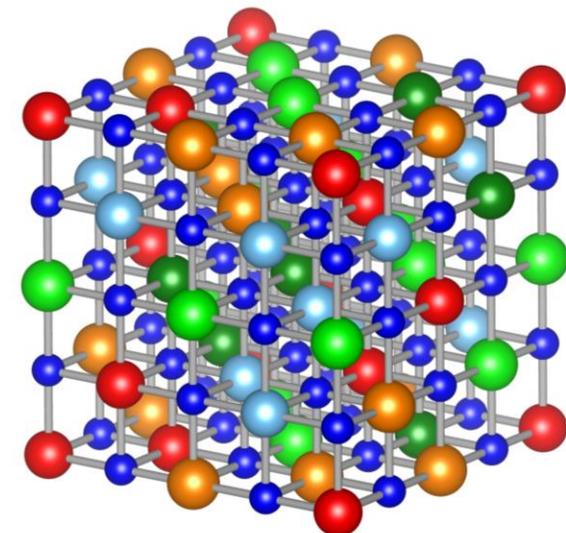
Predictive Solid-state Theory

$$\hat{H}\Psi = E\Psi$$

→ problem of $\sim 10^{23}$ interacting particles

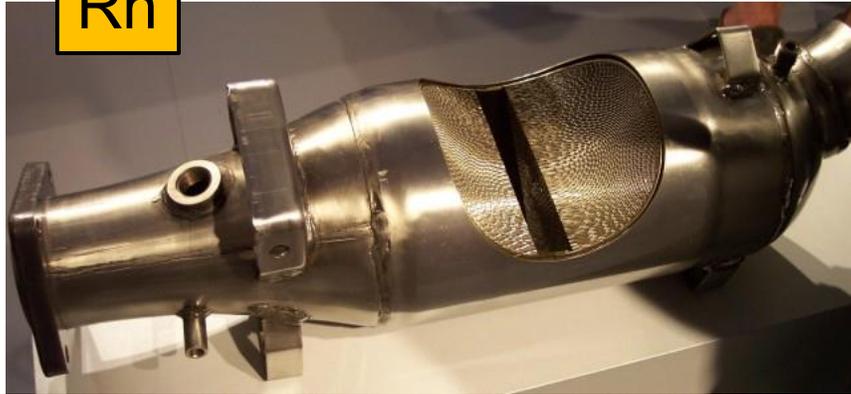
$$E_{\text{KS}}[n] = T_s[\{\phi_i[n]\}] + V_{\text{eK}}[n] + U_{\text{H}}[n] + E_{\text{xc}}[n]$$

→ DFT as ultimate work horse for predictive materials discovery

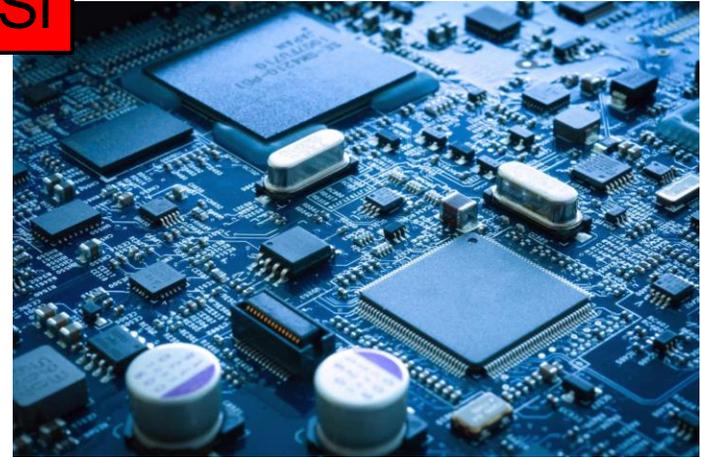


Materials, Science & Technology

Rh



Si



Li

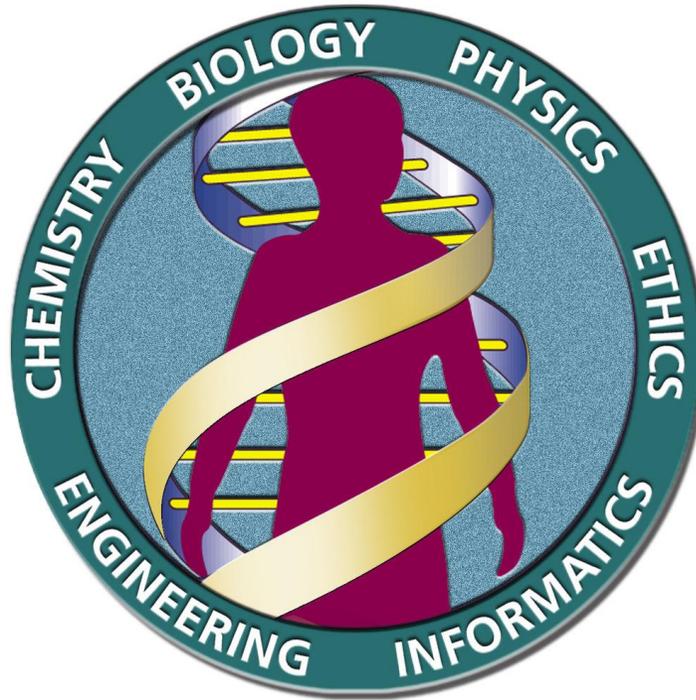


CoPt



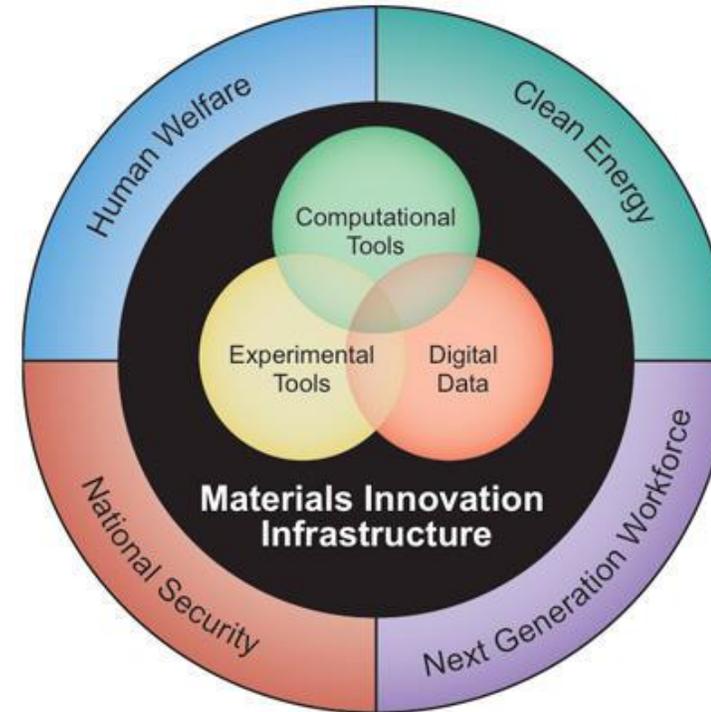
Materials Genome Initiative

Human Genome Project (1990-2003)



By U.S. Department of Energy, Human Genome Project -
<http://www.ornl.gov/hgmis>, Public Domain,
<https://commons.wikimedia.org/w/index.php?curid=2485616>

Materials Genome Initiative (2011)



<https://www.mgi.gov/>

Materials Genome Initiative – Databases

<http://aflow.org/>

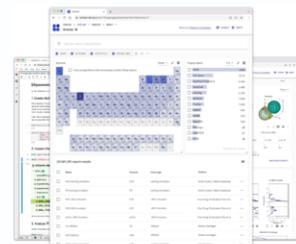
<https://materialsproject.org/>

<http://oqmd.org/>

...

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Open NOMAD →

<https://nomad-lab.eu/nomad-lab/>

<https://www.materialscloud.org/>

CMR

Each CMR project in the table below consists of an ASE-database and a project page describing the data and showing examples of how to work with the data using Python and ASE. Browse the databases by clicking the [browse] links below or download the databases and explore them using ASE tools:

- ase.db command-line tool
- ase.db Python module
- web-interface

Other links:

- CAMD-Web software
- OPTIMADE-API

All CMR databases are licensed under a [Creative Commons Attribution-ShareAlike 4.0 International License](https://creativecommons.org/licenses/by-sa/4.0/)



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



Databases

Geometries optimized with PBE

- Optimade interface
- Download complete database (in json format): 3D [2024.12.04], 2D, 1D
- Download geometry optimization paths (in json format): 3D, 2D, 1D
- Download convex hull only: 3D [2024.12.14]
- List of POTCARs used
- Download all prototypes in cif format
- For large-scale machine learning applications we provide an DGL and PyG LMDB dataset implementation
- References: 10.1002/adma.202110788 (3D), 10.1088/2053-1583/acce43 (2D), 10.1126/sciadv.ab7948 (method)

Geometries optimized with PBEsol

- Optimade interface
- Download complete database (in json format): PBEsol, SCAN
- Download geometry optimization paths (in json format): PBEsol
- Download convex hull only: PBEsol, SCAN
- List of POTCARs used
- Download phonon and electron-phonon data calculated with Quantum Espresso
- Download phonon and electron-phonon data for 2D compounds calculated with Quantum Espresso
- References: 10.1038/s41597-022-01177-w (ground-state), 10.1002/adfm.202404043 (phonons)

<https://alexandria.icams.rub.de/>

Outline

1. The AFLOW Database and Software

- AFLOW Apps and search functionality

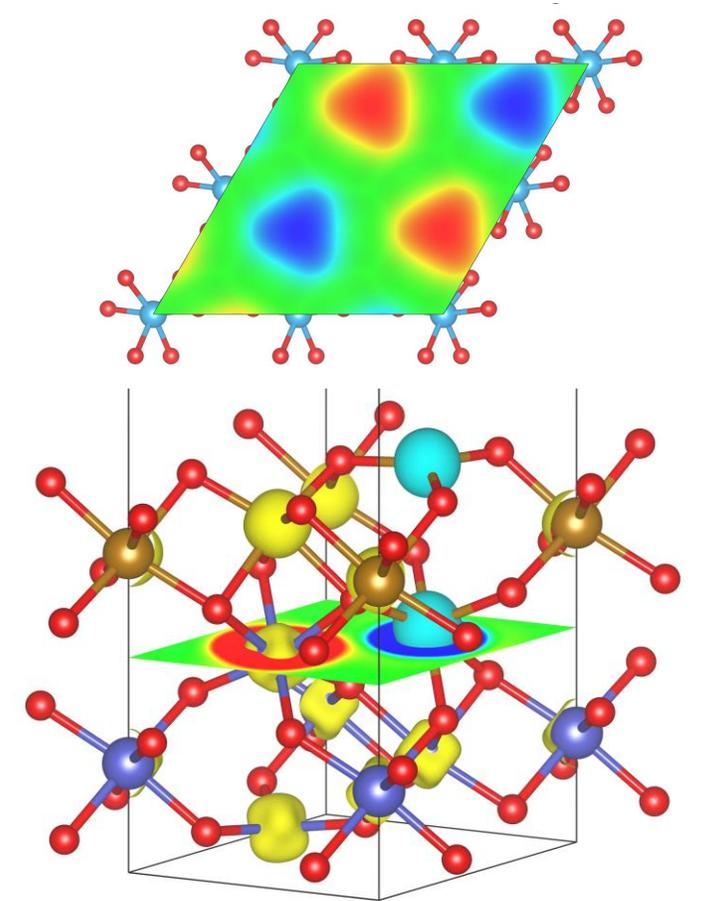
2. Data-driven Quest for Non-vdW 2D Materials

- Search criterion
- Exfoliation energies and properties

3. Magnetic State Control via Hydrogenation

- Surface Passivation
- Magnetic state switching

AFLOW
Automatic - FLOW for Materials Discovery



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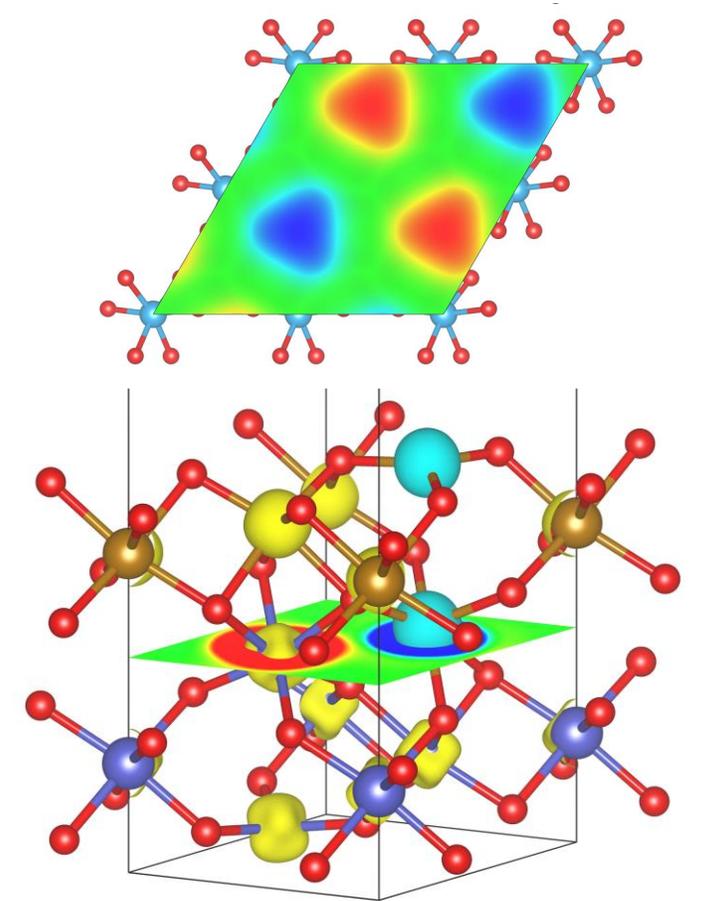
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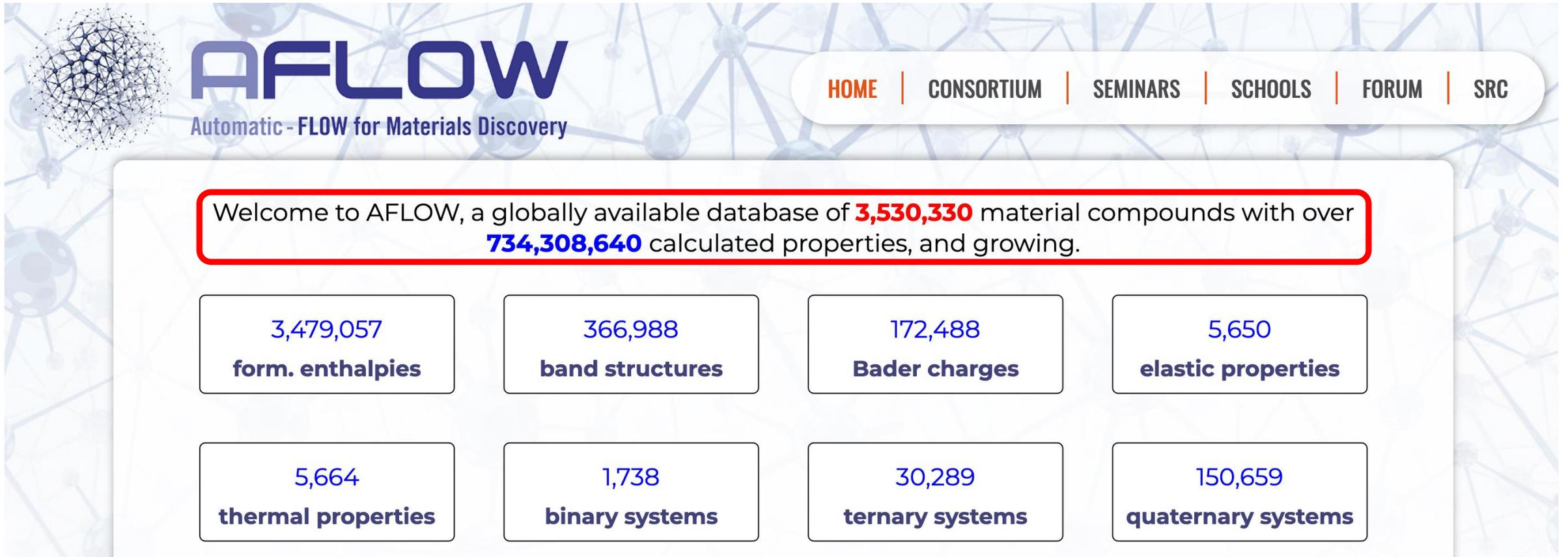
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AFLOW Database & Software: aflow.org



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Welcome to AFLOW, a globally available database of **3,530,330** material compounds with over **734,308,640** calculated properties, and growing.

3,479,057 form. enthalpies	366,988 band structures	172,488 Bader charges	5,650 elastic properties
5,664 thermal properties	1,738 binary systems	30,289 ternary systems	150,659 quaternary systems

Duke
UNIVERSITY

S. Curtarolo *et al.*, *Comput. Mater. Sci.* **58**, 218 (2012); S. Curtarolo *et al.*, *Comput. Mater. Sci.* **58** 227 (2012);
M. Esters *et al.*, *Comput. Mater. Sci.* **216**, 111808 (2023);
C. Oses *et al.*, *Comput. Mater. Sci.* **217**, 111889 (2023);
S. Divilov *et al.*, *High Entropy Alloys & Materials* **3**, 178 (2025)

UNTERSTÜTZT VON / SUPPORTED BY



Alexander von
HUMBOLDT
STIFTUNG

AFLOW Software & Apps at aflow.org

AFLOW

Automatic - FLOW for Materials Discovery

S. Curtarolo *et al.*, *Comput. Mater. Sci.* **58**, 218 (2012)

- written in C++ utilizing VASP as density functional theory program
- AFLOW standard for:
 - *k*-point sets
 - plane wave cutoffs
 - PAW data sets ...

C. E. Calderon *et al.*, *Comput. Mater. Sci.* **108**, 233 (2015)



G. Kresse and J. Hafner, *Phys. Rev. B* **49**, 14251 (1994)

G. Kresse and J. Furthmüller, *Phys. Rev. B* **54**, 11169 (1996)

G. Kresse and J. Furthmüller, *Comput. Mater. Sci.* **6**, 15 (1996)

MendeLIB search



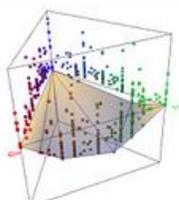
AFLOW database search application

Prototype encyclopedia



The AFLOW Prototype Encyclopedia with over 1,100 prototypes

AFLOW-CHULL



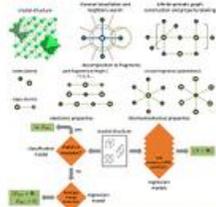
Convex HULL application for thermodynamic stability and synthesizability

AFLOW-online



Online interface for AFLOW's symmetry, structure comparison, CCE, POCC, and other functionality

AFLOW-ML



Machine Learning application for the PLMF, MDF, and ASC model

REST-API Docs



Documentation for the AFLOW REST-API

➤ the AFLOW software is structured into purpose dedicated, fully interoperable modules

AFLOW.org Search Page



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Search Aflow x

ICSD only All AFLOW

Search (60379 entries) Display

Property Filters Periodic Table Property Filters

1 H Hydrogen	<table border="1"> <tr> <td>Metals</td> <td>Alkali Metals</td> <td>Alkali Earths</td> <td>and</td> <td>not</td> </tr> <tr> <td>Transition Metals</td> <td>Lanthanides</td> <td>Other Metals</td> <td>or</td> <td>xor</td> </tr> <tr> <td>Non-Metals</td> <td>Boron Group</td> <td>Carbon Group</td> <td>(</td> <td>)</td> </tr> <tr> <td>Pnictogens</td> <td>Chalcogens</td> <td>Halogens</td> <td colspan="2"> # of species <input type="text"/> = <input type="text"/> </td> </tr> </table>																Metals	Alkali Metals	Alkali Earths	and	not	Transition Metals	Lanthanides	Other Metals	or	xor	Non-Metals	Boron Group	Carbon Group	()	Pnictogens	Chalcogens	Halogens	# of species <input type="text"/> = <input type="text"/>		2 He Helium
Metals	Alkali Metals	Alkali Earths	and	not																																	
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Pnictogens	Chalcogens	Halogens	# of species <input type="text"/> = <input type="text"/>																																		
3 Li Lithium	4 Be Beryllium	5 B Boron	6 C Carbon	7 N Nitrogen	8 O Oxygen	9 F Fluorine	10 Ne Neon	11 Na Sodium	12 Mg Magnesium	13 Al Aluminum	14 Si Silicon	15 P Phosphorus	16 S Sulfur	17 Cl Chlorine	18 Ar Argon																						
19 K Potassium	20 Ca Calcium	21 Sc Scandium	22 Ti Titanium	23 V Vanadium	24 Cr Chromium	25 Mn Manganese	26 Fe Iron	27 Co Cobalt	28 Ni Nickel	29 Cu Copper	30 Zn Zinc	31 Ga Gallium	32 Ge Germanium	33 As Arsenic	34 Se Selenium	35 Br Bromine	36 Kr Krypton																				
37 Rb Rubidium	38 Sr Strontium	39 Y Yttrium	40 Zr Zirconium	41 Nb Niobium	42 Mo Molybdenum	43 Tc Technetium	44 Ru Ruthenium	45 Rh Rhodium	46 Pd Palladium	47 Ag Silver	48 Cd Cadmium	49 In Indium	50 Sn Tin	51 Sb Antimony	52 Te Tellurium	53 I Iodine	54 Xe Xenon																				
55 Cs Cesium	56 Ba Barium	57 - 71 Lanthanides	72 Hf Hafnium	73 Ta Tantalum	74 W Tungsten	75 Re Rhenium	76 Os Osmium	77 Ir Iridium	78 Pt Platinum	79 Au Gold	80 Hg Mercury	81 Tl Thallium	82 Pb Lead	83 Bi Bismuth	84 Po Polonium	85 At Astatine	86 Rn Radon																				
57 La Lanthanum	58 Ce Cerium	59 Pr Praseodymium	60 Nd Neodymium	61 Pm Promethium	62 Sm Samarium	63 Eu Europium	64 Gd Gadolinium	65 Tb Terbium	66 Dy Dysprosium	67 Ho Holmium	68 Er Erbium	69 Tm Thulium	70 Yb Ytterbium	71 Lu Lutetium																							



Center for Autonomous Materials Design, Materials Science, Duke University

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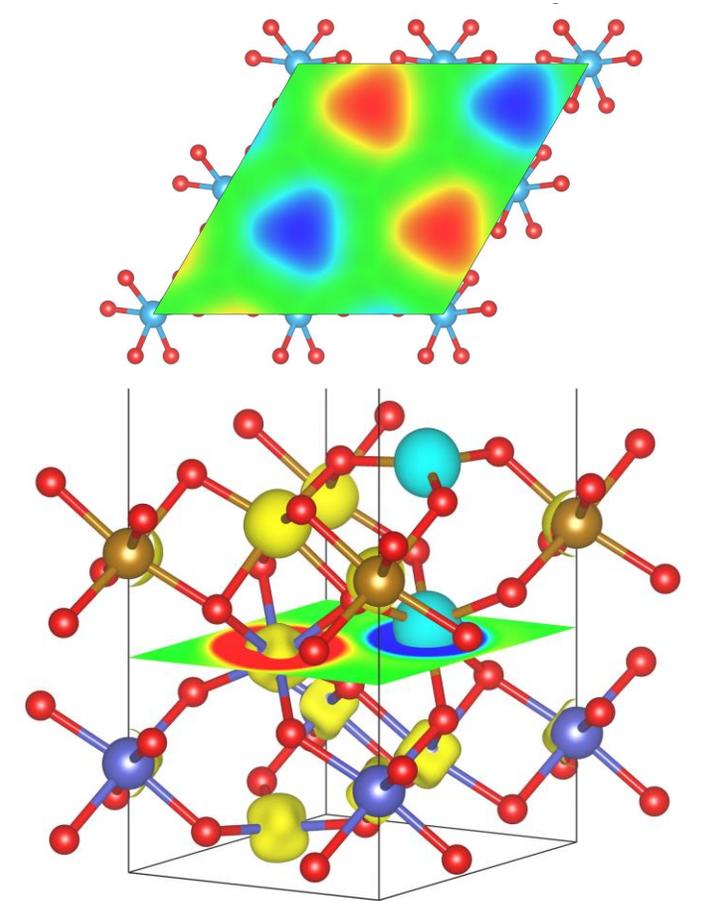
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- Search criterion
- Exfoliation energies and properties

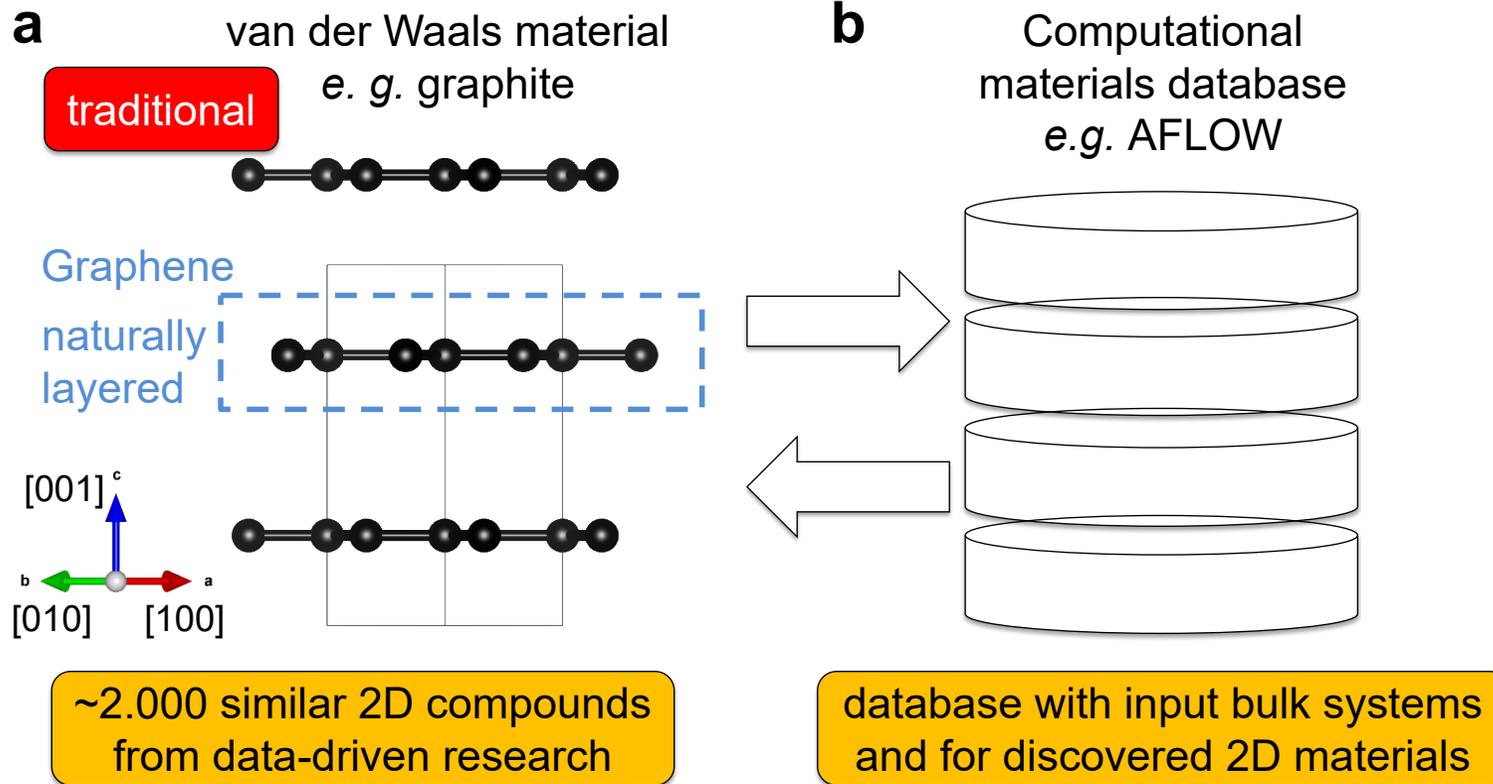
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- Surface Passivation
- Magnetic state switching

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Traditional vs. Energy Mgt. Materials



- data-driven research predicted several thousands of vdW 2D systems

N. Mounet *et al.*, Nat. Nanotechnol. **13**, 246 (2018)

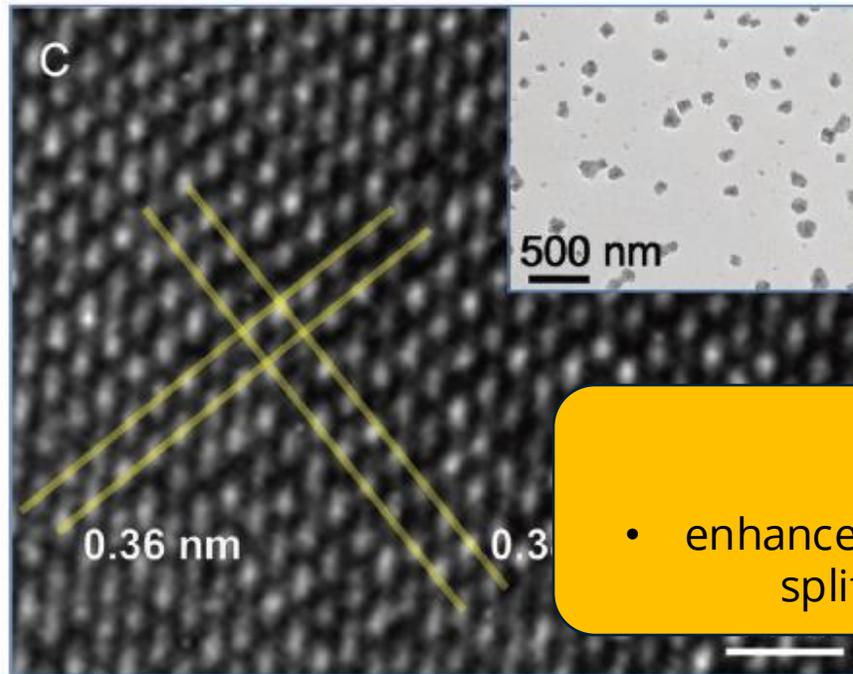
See also: S. Lebegue *et al.*, Phys. Rev. X **3**, 031002 (2013); G. Cheon *et al.*, Nano. Lett. **17**, 1915 (2017)

→ Can we obtain 2D sheets from non-vdW materials?

Electrostatic-Driven Exfoliation and Hybridization of 2D Nanomaterials

Guijian Guan, Jing Xia, Shuhua Liu, Yuan Cheng, Shiqiang Bai, Si Yin Tee, Yong-Wei Zhang,* and Ming-Yong Han*

WO₃ exfoliation

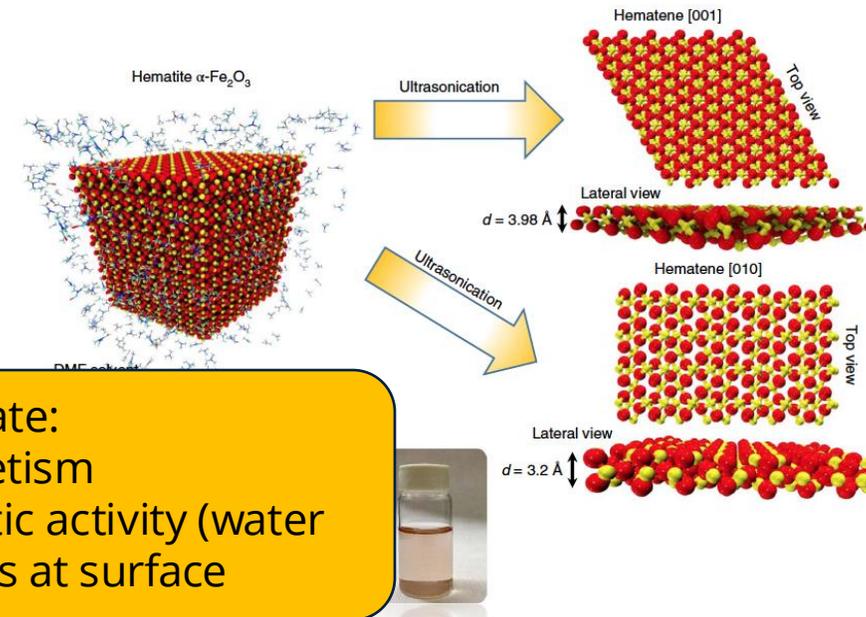


G. Guan *et al.*, *Adv. Mater.* **29**, 1700326 (2017)

- results indicate:
- ferromagnetism
 - enhanced photocatalytic activity (water splitting) → cations at surface

Exfoliation of a non-van der Waals material from iron ore hematite

Aravind Puthirath Balan^{1,2,11}, Sruthi Radhakrishnan^{1,11}, Cristiano F. Woellner³, Shyam K. Sinha⁴, Liangzi Deng⁵, Carlos de los Reyes⁶, Banki Manmadha Rao⁷, Maggie Paulose⁷, Ram Neupane⁷, Amey Apte¹, Vidya Kochat¹, Robert Vajtai¹, Avetik R. Harutyunyan⁸, Ching-Wu Chu^{5,9}, Gelu Costin¹⁰, Douglas S. Galvao³, Angel A. Marti⁶, Peter A. van Aken⁴, Oomman K. Varghese⁷, Chandra Sekhar Tiwary^{1*}, Anantharaman Malie Madom Ramaswamy Iyer^{1,2*} and Pulickel M. Ajayan^{1*}



A. Puthirath Balan *et al.*, *Nat. Nanotechnol.* **13**, 602 (2018)

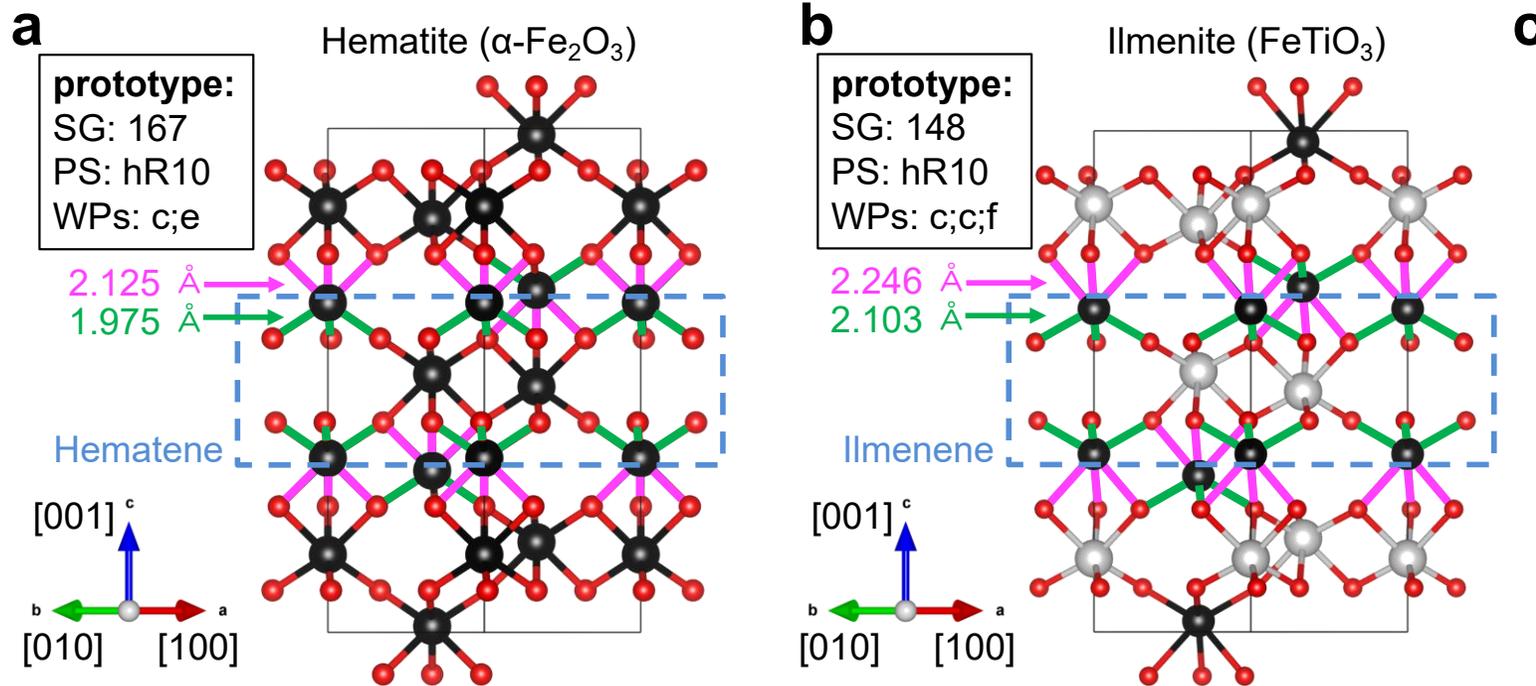
A. Puthirath Balan *et al.*, *Chem. Mater.* **30**, 5923 (2018)

A. Puthirath *et al.*, *J. Phys. Chem. C* **125**, 18927 (2021)

→ Results shatter intuitive understanding of exfoliability (and cleavage)

See also: K. Jiang *et al.*, *Nat. Synth.* **2**, 58 (2023)

Discovering Non-vdW 2D Materials

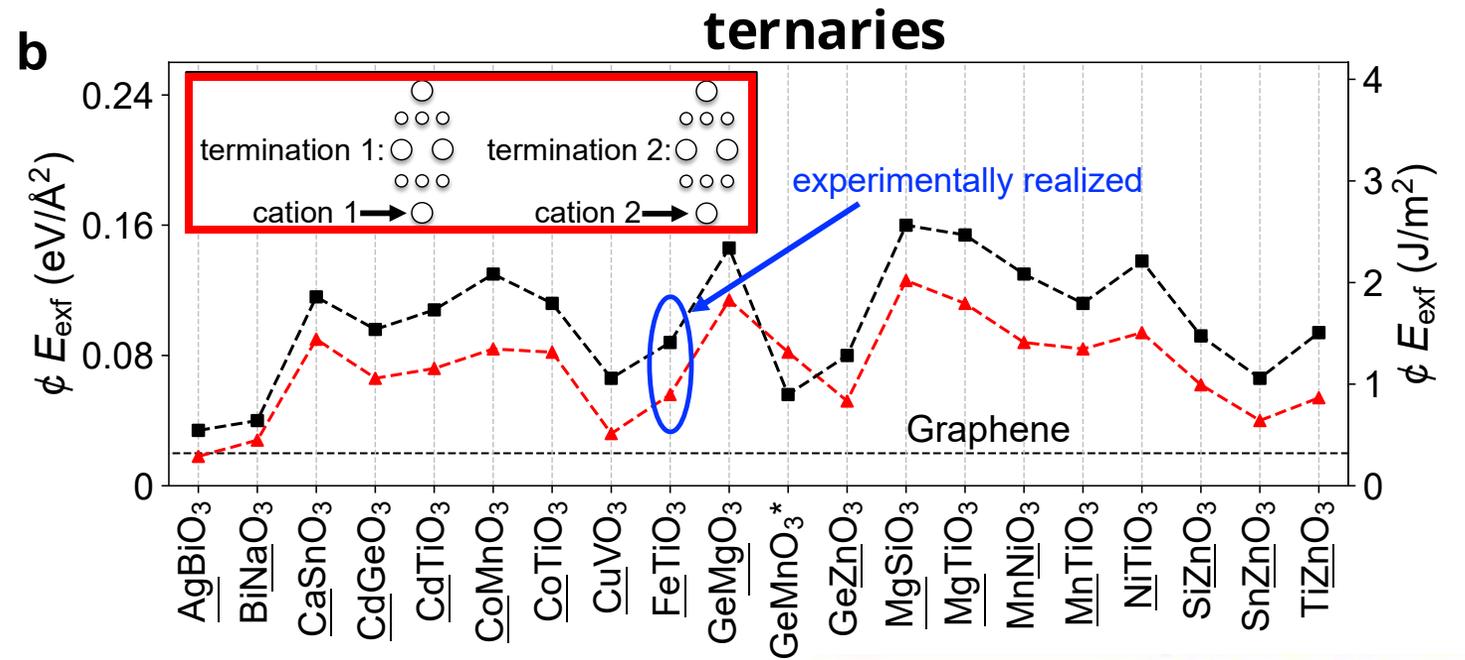
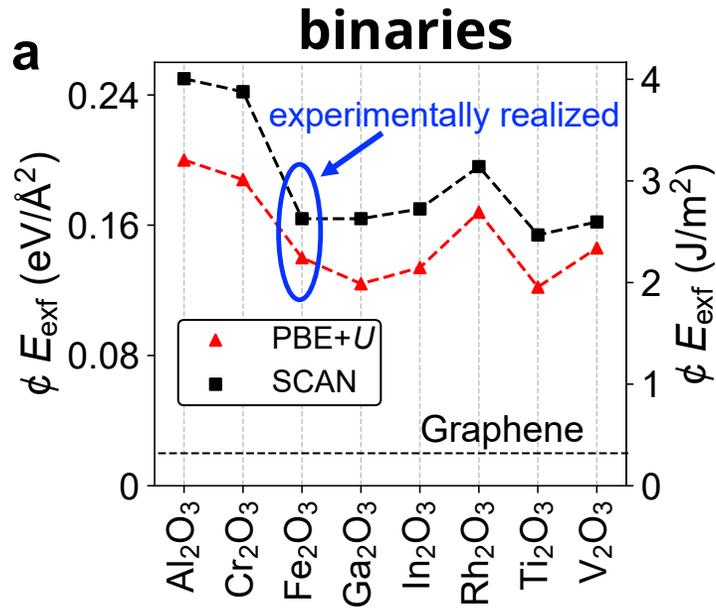


R. Friedrich, M. Ghorbani-Asl, S. Curtarolo and A. V. Krasheninnikov, Nano Lett. **22**, 989 (2022)

T. Barnowsky, A. V. Krasheninnikov, and R. Friedrich, Adv. El. Mats. **9**, 2201112 (2023)

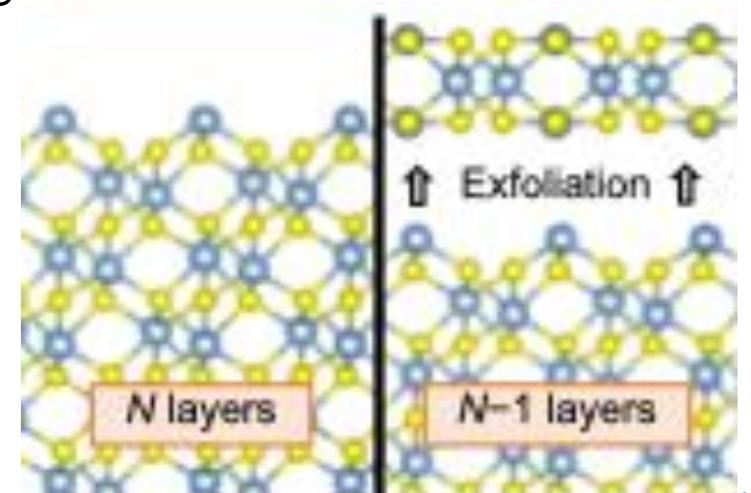
- use structural prototype of first experimentally realized materials to filter AFLOW database
→ oxides, sulfides, chlorides

Exfoliation Energies

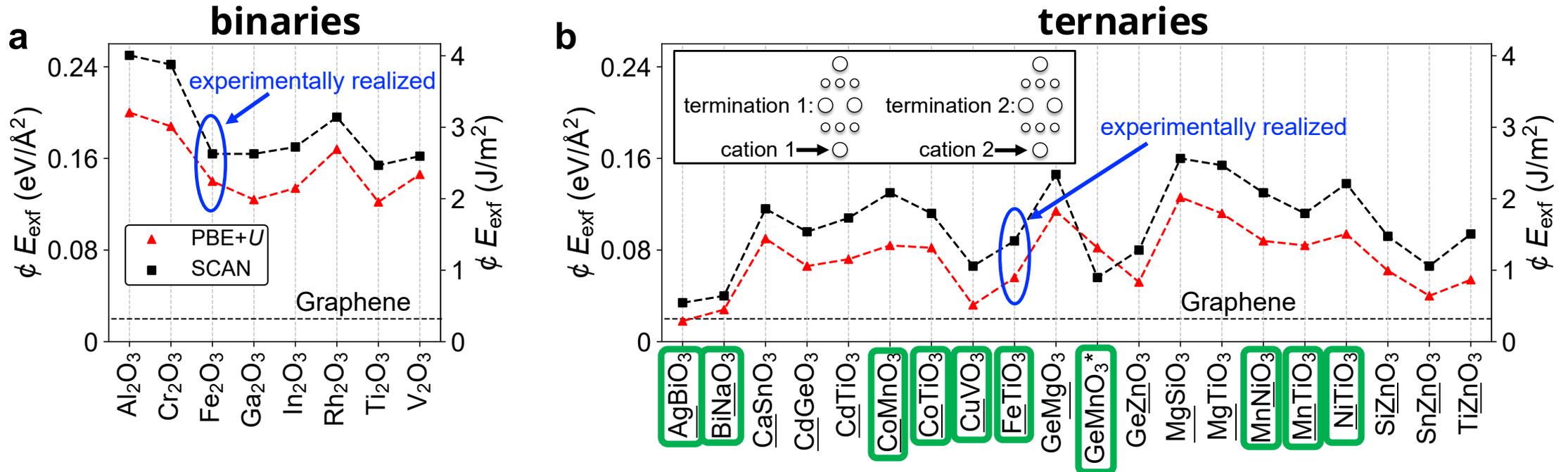


$$\Delta E_{\text{exf}} = \frac{E_{\text{slab}} - E_{\text{bulk}}}{A}$$

J. H. Jung *et al.*, Nano Lett. **18**, 2759 (2018)

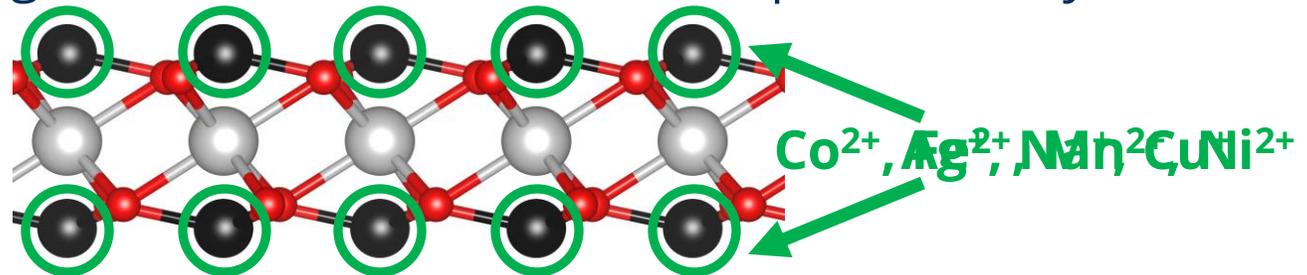


Exfoliation Energies



- all exfoliation energies are close to the ones of exp. realized systems

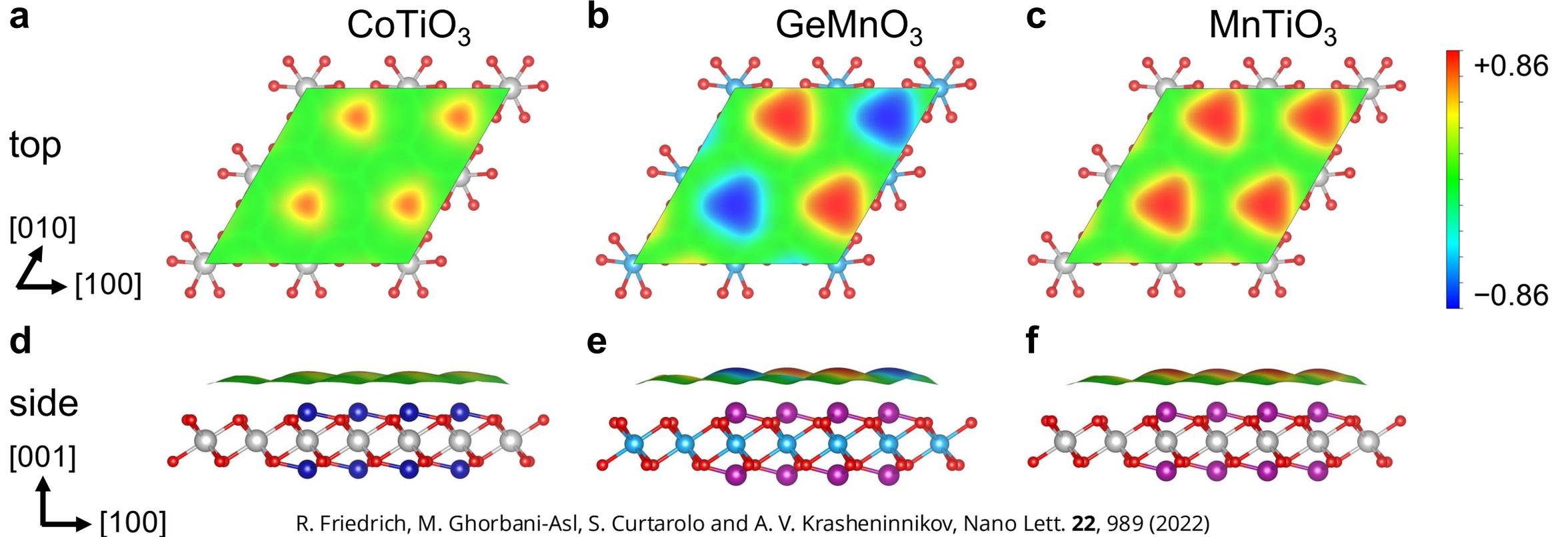
side view



→ easy exfoliation if **cation at surface** is in **low oxidation state**

→ predictive descriptor for future 2D materials discovery

Magnetism



- very diverse surface spin polarization for non-vdW 2D materials

$$P = \frac{n_{\uparrow} - n_{\downarrow}}{n_{\uparrow} + n_{\downarrow}}$$

measurable by spin-polarized scanning tunneling microscopy

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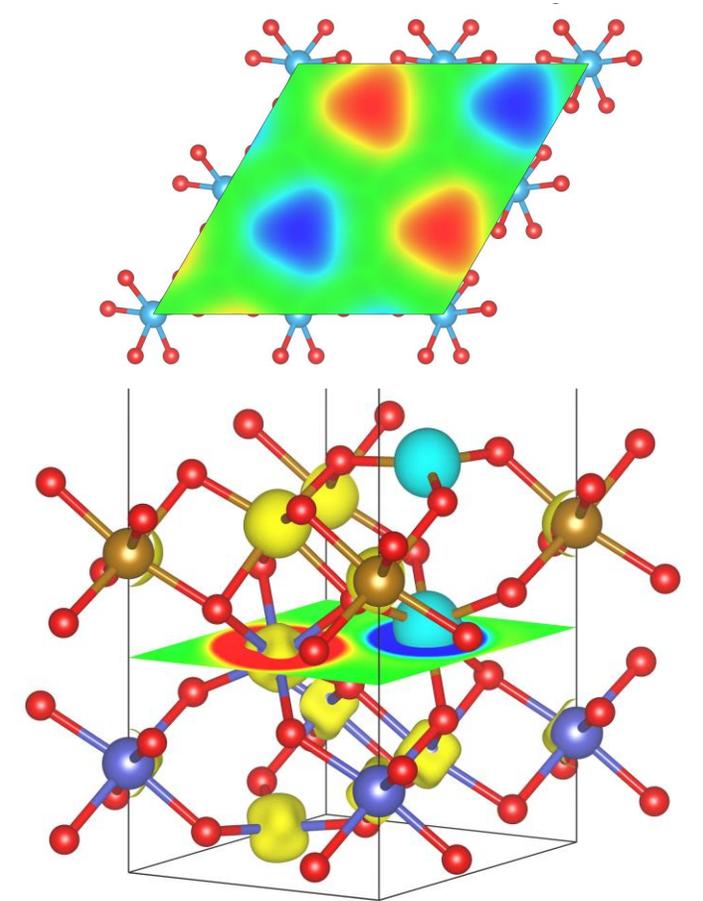
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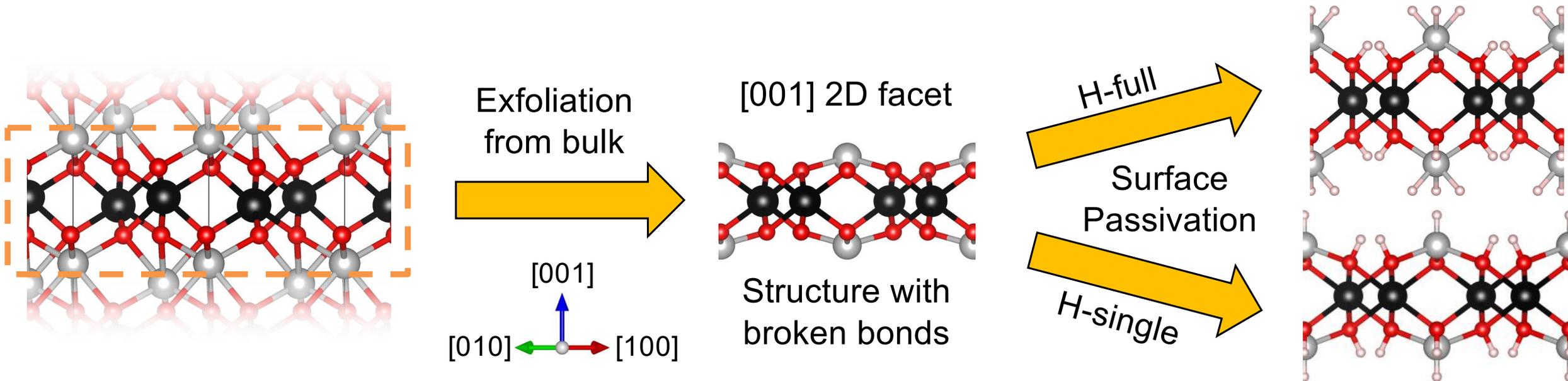
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Surface Passivation of Dangling Bonds



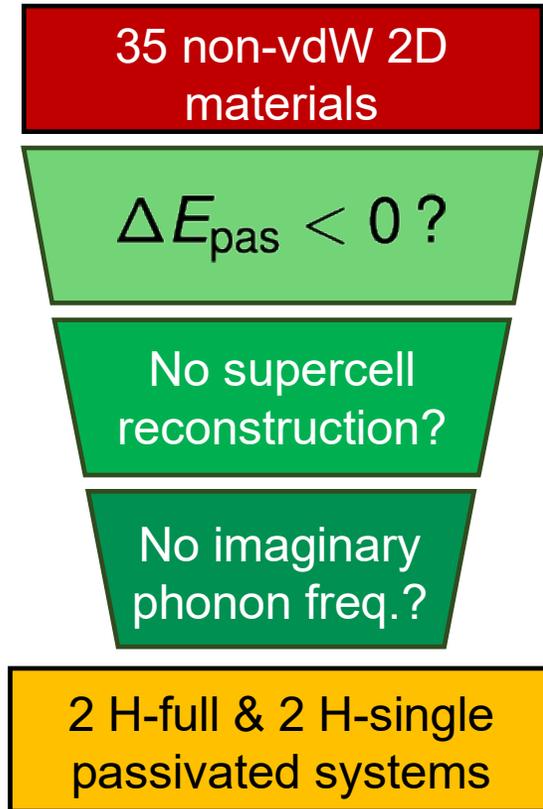
- different surface passivation types mimicking different H chemical potentials



Tom Barnowsky

Filtering Scheme

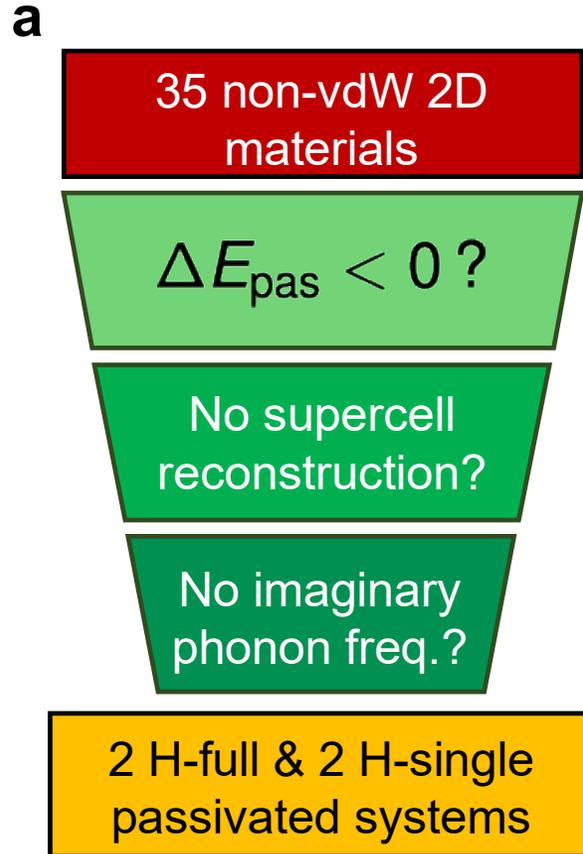
a



T. Barnowsky, S. Curtarolo, A. V. Krasheninnikov, T. Heine, and R. Friedrich, Nano Letters **24**, 3874 (2024)

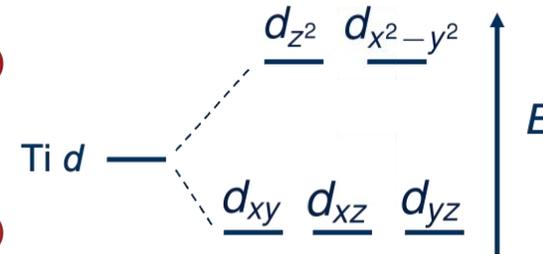
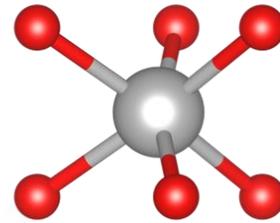
- only 4 out of 35 systems pass all stability tests
- special geometry for 2D CdTiO₃:H-single → validated from different starting geometries

Filtering Scheme

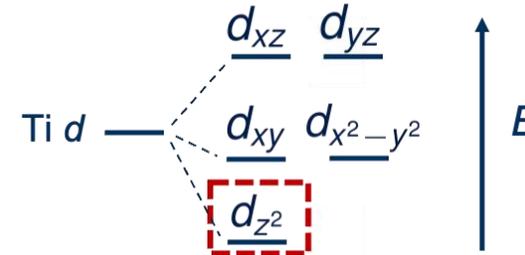
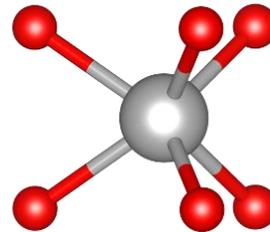


Coordination change during relax.

Octahedral

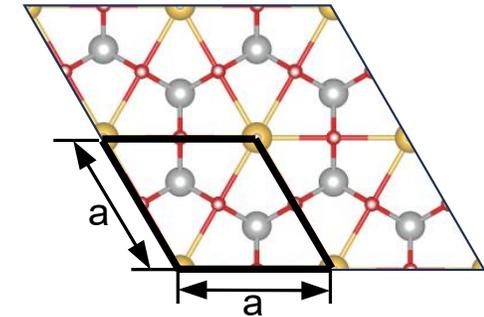
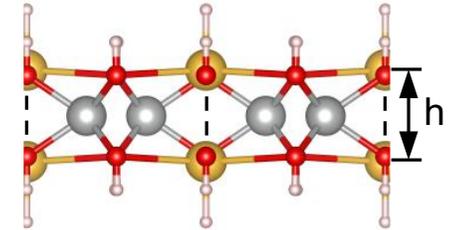


Trigonal-prismatic



e

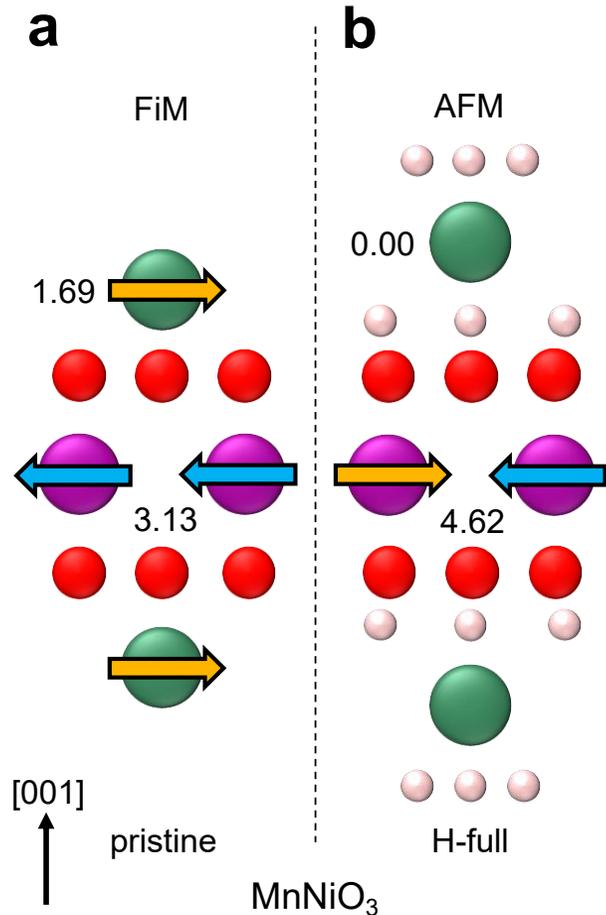
2D $\text{CdTiO}_3\text{:H}$ -single
 $\Delta E_{\text{pas}} = -0.14 \text{ eV/H}_2$



T. Barnowsky, S. Curtarolo, A. V. Krashennnikov, T. Heine, and R. Friedrich, Nano Letters **24**, 3874 (2024)

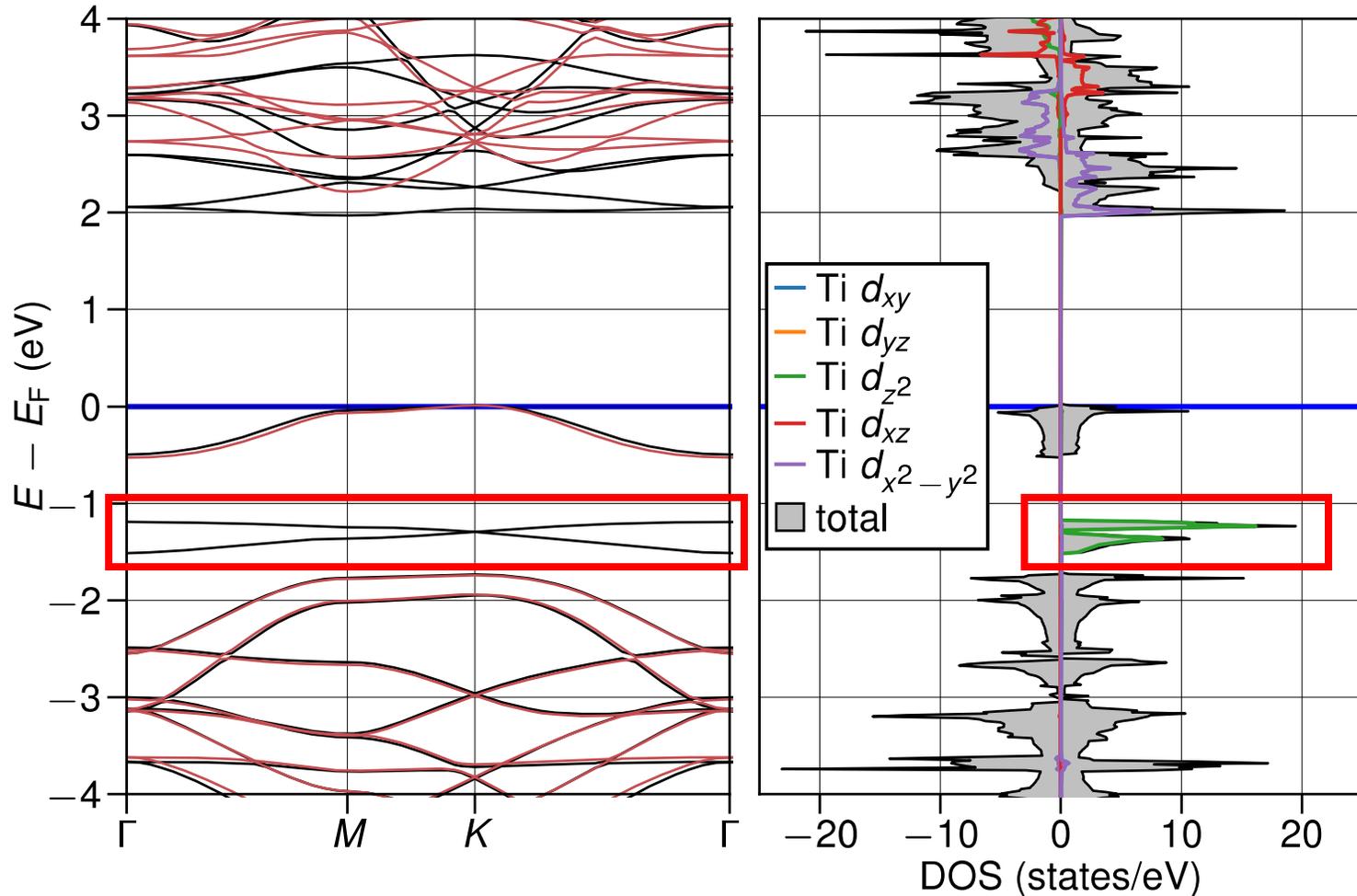
- only 4 out of 35 systems pass all stability tests
- special geometry for 2D $\text{CdTiO}_3\text{:H}$ -single \rightarrow validated from different starting geometries

Magnetic Configurations



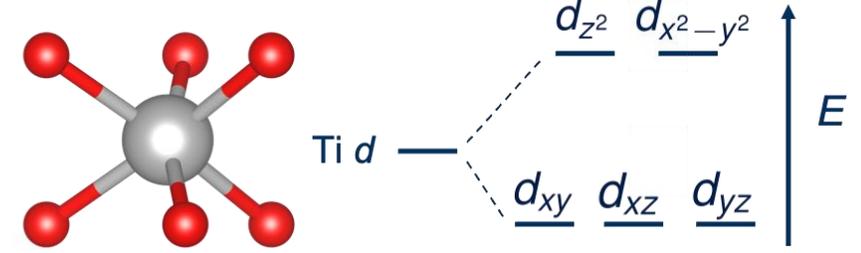
- switching to states with flipped and enhanced moments due to passivation
- onset of ferromagnetism for CdTiO₃:H-single → mean field Curie temperature $T_C^{MF} \sim 10\text{K}$

CdTiO₃:H-single Density of States

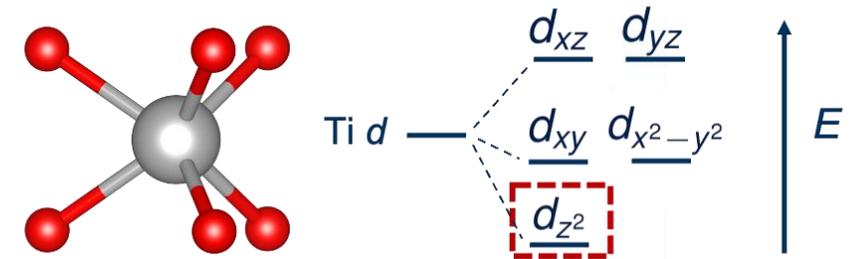


Coordination change during relax.

Octahedral



Trigonal-prismatic



- occupation of $3d_{z^2}$ majority spin bands connected to structural change

Magnetization Density Difference

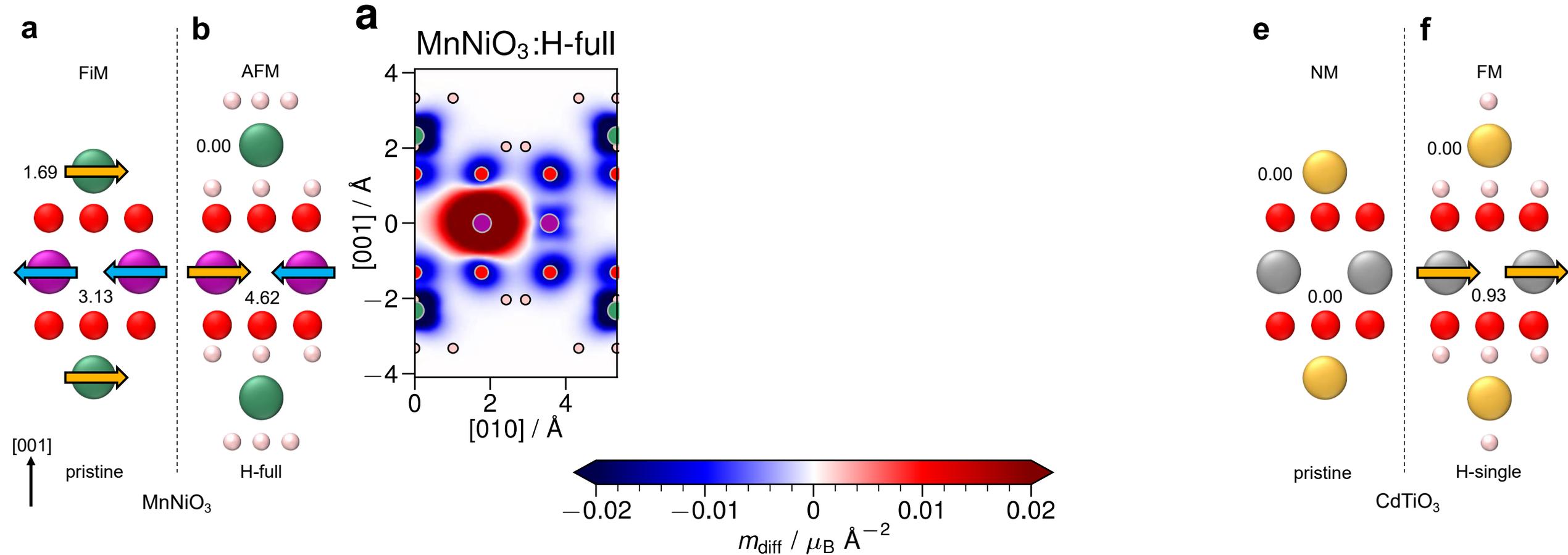
- magnetization density as difference between spin up and spin down electron densities:

$$m(\mathbf{r}) = \mu_B(n_{\uparrow}(\mathbf{r}) - n_{\downarrow}(\mathbf{r}))$$

- magnetization density difference between pristine and passivated systems:

$$m_{\text{diff}}(\mathbf{r}) = m_{\text{passivated}}(\mathbf{r}) - m_{\text{pristine}}^{\text{SCF}}(\mathbf{r})$$

Magnetization Density Difference



T. Barnowsky, S. Curtarolo, A. V. Krasheninnikov, T. Heine, and R. Friedrich, Nano Letters **24**, 3874 (2024)

- local spin symmetry change for MnNiO₃:H-full
- CdTiO₃:H-single: spin transfer to Ti in $3d_{z^2}$ orbital shape

Summary and Conclusions

- data-driven materials design is a powerful tool enabling the discovery of novel compounds
- non-van der Waals 2D materials represent an emerging new class of low-dimensional compounds
- their active cation-terminated surfaces give rise to strong surface spin polarization and magnetic state control through passivation

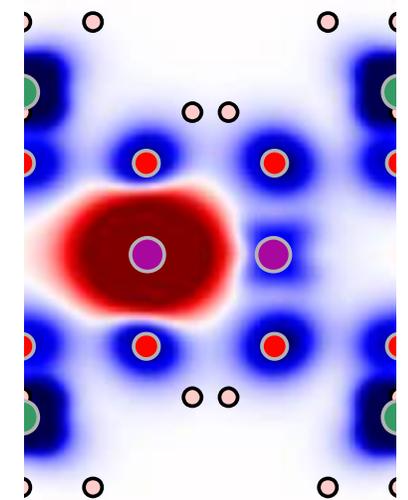
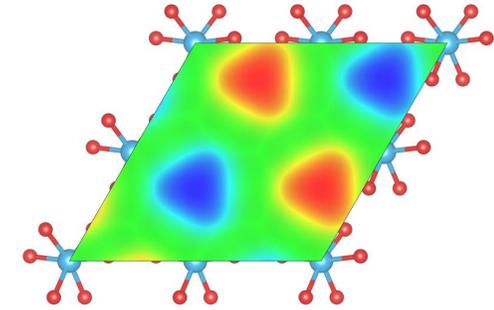
R. Friedrich, M. Ghorbani-Asl, S. Curtarolo and A. V. Krasheninnikov, *Nano Lett.* **22**, 989 (2022)

T. Barnowsky, A. V. Krasheninnikov, and R. Friedrich, *Adv. El. Mats.* **9**, 2201112 (2023)

T. Barnowsky, S. Curtarolo, A. V. Krasheninnikov, T. Heine, and R. Friedrich, *Nano Letters* **24**, 3874 (2024)

A. Nihei, T. Barnowsky, and R. Friedrich, submitted, arXiv:2503.12209 (2025)

A. P. Balan *et al.*, *Materials Today* **58**, 164 (2022)



Thank You for Your Attention



+ Balaram Thakur



collaborators:

- TU Dresden: Thomas Heine, Alexander Eychmüller, Carsten Timm, Kevin Synnatschke, Michael Ruck, Gianaurelio Cuniberti
- HZDR: Thomas Kühne, Agnieszka Kuc, Mahdi Ghorbani-Asl, Arkady V. Krasheninnikov
- Rice University: Anand B. Puthirath, Aravind Puthirath Balan, Pulickel M. Ajayan
- FZ Jülich: Daniel Wortmann, Gregor Michalicek, Gustav Bihlmayer, Stefan Blügel
- IFW Dresden: Axel Lubk, Kornelius Nielsch
- Duke University: Hagen Eckert, Simon Divilov, Stefano Curtarolo
- UT Dallas: Cormac Toher



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AFLOW.org Search Page

The screenshot shows the AFLOW.org search interface. At the top, there is a navigation bar with links for HOME, CONSORTIUM, PUBLICATIONS, FORUM, SRC, and SEARCH. Below this is a search bar with a dropdown menu set to 'ICSD only' and a 'Search' button indicating 60379 entries. A 'Display' button is also present. The main area features a 'Periodic Table' with various element groups highlighted in different colors: Metals (blue), Alkali Metals (orange), Alkali Earths (red), Transition Metals (green), Lanthanides (light blue), Other Metals (purple), Non-Metals (yellow), Boron Group (dark blue), Carbon Group (dark green), Pnictogens (teal), Chalcogens (orange-red), and Halogens (red). To the right of the periodic table is a 'Property Filter' section with a '# of species' input field. Below the periodic table is a logic operations section with buttons for 'and', 'not', 'or', and 'xor', along with parentheses. The bottom of the page displays logos for partner institutions: Duke University, University at Buffalo, Missouri S&T, NC State University, Penn State, and NSF. The footer text reads: 'Center for Autonomous Materials Design, Materials Science, Duke University'.

Element group selection

Number of species

Logic operations

Element selection

AFLOW.org Search Page

The screenshot shows the AFLOW.org search interface. At the top, there is a navigation bar with links for HOME, CONSORTIUM, PUBLICATIONS, FORUM, SRC, and SEARCH. Below this is a search bar with the text "Search Aflow" and a dropdown menu currently set to "ICSD only". To the right of the search bar is a green "Search" button indicating 60379 entries and a "Display" button. Below the search bar is a "Periodic Table" section with various filters and a search logic interface. Two orange callout boxes with arrows point to specific elements: one points to Hydrogen (H) with the text "Slide to Property Filters", and the other points to Helium (He) with the text "Bring property filters onto search page".

Property Filters

Metals	Alkali Metals	Alkali Earths
Transition Metals	Lanthanides	Other Metals
Non-Metals	Boron Group	Carbon Group
Pnictogens	Chalcogens	Halogens

Search Logic

and not
or xor
()

of species

=

Periodic Table

1 H Hydrogen
2 He Helium
3 Li Lithium
4 Be Beryllium
5 B Boron
6 C Carbon
7 N Nitrogen
8 O Oxygen
9 F Fluorine
10 Ne Neon
11 Na Sodium
12 Mg Magnesium
13 Al Aluminum
14 Si Silicon
15 P Phosphorus
16 S Sulfur
17 Cl Chlorine
18 Ar Argon
19 K Potassium
20 Ca Calcium
21 Sc Scandium
22 Ti Titanium
23 V Vanadium
24 Cr Chromium
25 Mn Manganese
26 Fe Iron
27 Co Cobalt
28 Ni Nickel
29 Cu Copper
30 Zn Zinc
31 Ga Gallium
32 Ge Germanium
33 As Arsenic
34 Se Selenium
35 Br Bromine
36 Kr Krypton
37 Rb Rubidium
38 Sr Strontium
39 Y Yttrium
40 Zr Zirconium
41 Nb Niobium
42 Mo Molybdenum
43 Tc Technetium
44 Ru Ruthenium
45 Rh Rhodium
46 Pd Palladium
47 Ag Silver
48 Cd Cadmium
49 In Indium
50 Sn Tin
51 Sb Antimony
52 Te Tellurium
53 Iodine
54 Xe Xenon
55 Cs Cesium
56 Ba Barium
57-71 Lanthanides
72 Hf Hafnium
73 Ta Tantalum
74 W Tungsten
75 Re Rhenium
76 Os Osmium
77 Ir Iridium
78 Pt Platinum
79 Au Gold
80 Hg Mercury
81 Tl Thallium
82 Pb Lead
83 Bi Bismuth
84 Po Polonium
85 At Astatine
86 Rn Radon
87 Fr Francium
88 Ra Radium
89-103 Actinides
104 Rf Rutherfordium
105 Db Dubnium
106 Sg Seaborgium
107 Bh Bohrium
108 Hs Hassium
109 Mt Meitnerium
110 Ds Darmstadtium
111 Rg Roentgenium
112 Copernicium
113 Nh Nihonium
114 Fl Flerovium
115 Mc Moscovium
116 Lv Livermorium
117 Ts Tennessine
118 Og Oganesson

Property Filters

AFLOW.org Search Page


HOME | CONSORTIUM | PUBLICATIONS | FORUM | SRC | **SEARCH**

Search Aflow

Periodic Table

1 H Hydrogen	Metals Alkali Metals Alkali Earths Transition Metals Lanthanides Other Metals Non-Metals Boron Group Carbon Group Pnictogens Chalcogens Halogens																2 He Helium						
3 Li Lithium	4 Be Beryllium	5 B Boron	6 C Carbon	7 N Nitrogen	8 O Oxygen	9 F Fluorine	10 Ne Neon	<input type="text" value="and"/> <input type="text" value="not"/> <input type="text" value="or"/> <input type="text" value="xor"/> <input "="" type="text" value="("/> <input type="text" value=")"/>															
11 Na Sodium	12 Mg Magnesium	13 Al Aluminum	14 Si Silicon	15 P Phosphorus	16 S Sulfur	17 Cl Chlorine	18 Ar Argon	<input type="text" value="# of species"/>															
19 K Potassium	20 Ca Calcium	21 Sc Scandium	22 Ti Titanium	23 V Vanadium	24 Cr Chromium	25 Mn Manganese	26 Fe Iron	27 Co Cobalt	28 Ni Nickel	29 Cu Copper	30 Zn Zinc	31 Ga Gallium	32 Ge Germanium	33 As Arsenic	34 Se Selenium	35 Br Bromine	36 Kr Krypton						
37 Rb Rubidium	38 Sr Strontium	39 Y Yttrium	40 Zr Zirconium	41 Nb Niobium	42 Mo Molybdenum	43 Tc Technetium	44 Ru Ruthenium	45 Rh Rhodium	46 Pd Palladium	47 Ag Silver	48 Cd Cadmium	49 In Indium	50 Sn Tin	51 Sb Antimony	52 Te Tellurium	53 I Iodine	54 Xe Xenon						
55 Cs Cesium	56 Ba Barium	57-71 Lanthanides	72 Hf Hafnium	73 Ta Tantalum	74 W Tungsten	75 Re Rhenium	76 Os Osmium	77 Ir Iridium	78 Pt Platinum	79 Au Gold	80 Hg Mercury	81 Tl Thallium	82 Pb Lead	83 Bi Bismuth	84 Po Polonium	85 At Astatine	86 Rn Radon						
57 La Lanthanum	58 Ce Cerium	59 Pr Praseodymium	60 Nd Neodymium	61 Pm Promethium	62 Sm Samarium	63 Eu Europium	64 Gd Gadolinium	65 Tb Terbium	66 Dy Dysprosium	67 Ho Holmium	68 Er Erbium	69 Tm Thulium	70 Yb Ytterbium	71 Lu Lutetium									

Property Filters

Property Filters

Search Properties

Electronic Properties	band gap type Describes if the system is a metal, a semi-metal, or an insulator with direct or indirect band gap.	<input type="button" value="Add"/>	<input type="button" value="X"/>
Magnetic Properties	electronic band gap Electronic band gap.	<input type="button" value="Add"/>	<input type="button" value="X"/>
Mechanical Properties			
Thermodynamic Properties			
Relaxed Structure			
Chemistry			
Calculation Details			

space group
 Display column
 Restrict value
 from to

Pearson symbol
 Display column
 Restrict value
 equal to

AFLOW.org Search Page


HOME | CONSORTIUM | PUBLICATIONS | FORUM | SRC | SEARCH

ICSD only
 All AFLOW

Periodic Table

Metals			Alkali Metals			Alkali Earths			Transition Metals			Lanthanides			Other Metals		
Non-Metals			Boron Group			Carbon Group			Pnictogens			Chalcogens			Halogens		

of species:

4	Be	Beryllium	5	B	Boron	6	C	Carbon	7	N	Nitrogen	8	O	Oxygen	9	F	Fluorine	10	Ne	Neon																																				
11	Na	Sodium	12	Mg	Magnesium	13	Al	Aluminum	14	Si	Silicon	15	P	Phosphorus	16	S	Sulfur	17	Cl	Chlorine	18	Ar	Argon																																	
19	K	Potassium	20	Ca	Calcium	21	Sc	Scandium	22	Ti	Titanium	23	V	Vanadium	24	Cr	Chromium	25	Mn	Manganese	26	Fe	Iron	27	Co	Cobalt	28	Ni	Nickel	29	Cu	Copper	30	Zn	Zinc	31	Ga	Gallium	32	Ge	Germanium	33	As	Arsenic	34	Se	Selenium	35	Br	Bromine	36	Kr	Krypton			
37	Rb	Rubidium	38	Sr	Strontium	39	Y	Yttrium	40	Zr	Zirconium	41	Nb	Niobium	42	Mo	Molybdenum	43	Tc	Technetium	44	Ru	Ruthenium	45	Rh	Rhodium	46	Pd	Palladium	47	Ag	Silver	48	Cd	Cadmium	49	In	Indium	50	Sn	Tin	51	Sb	Antimony	52	Te	Tellurium	53	I	Iodine	54	Xe	Xenon			
55	Cs	Cesium	56	Ba	Barium	57-71	Lanthanides					72	Hf	Hafnium	73	Ta	Tantalum	74	W	Tungsten	75	Re	Rhenium	76	Os	Osmium	77	Ir	Iridium	78	Pt	Platinum	79	Au	Gold	80	Hg	Mercury	81	Tl	Thallium	82	Pb	Lead	83	Bi	Bismuth	84	Po	Polonium	85	At	Astatine	86	Rn	Radon
57	La	Lanthanum	58	Ce	Cerium	59	Pr	Praseodymium	60	Nd	Neodymium	61	Pm	Promethium	62	Sm	Samarium	63	Eu	Europium	64	Gd	Gadolinium	65	Tb	Terbium	66	Dy	Dysprosium	67	Ho	Holmium	68	Er	Erbium	69	Tm	Thulium	70	Yb	Ytterbium	71	Lu	Lutetium												

Selected Elements

Number of species=2

Added filter for Egap: electronic band gap

Select "Add" to add filter

Check box to restrict search results to specific value range

Property Filters

Search Properties

Electronic Properties	band gap type Describes if the system is a metal, semiconductor, or insulator with or without a band gap.	<input checked="" type="checkbox"/> Add	<input type="button" value="x"/>
Mechanical Properties			
Thermodynamic Properties			
Relaxed Structure			
Chemistry			
Calculation Details			

space group
 Display column
 Restrict value
 from 1 to 230

Pearson symbol
 Display column
 Restrict value
 equal to

electronic band gap
 Display column
 Restrict value
 from 0 to 17.6792 eV

AFLOW.org Search Page

Live demo examples:

1. Let us use the advanced search functionality to find the band gap for SiC in the zincblende structure (space group number 216).
2. Let us use the advanced search functionality to find the materials containing Sn but not Pb with band gaps between 1 eV and 3 eV in the ICSD catalog of the AFLOW database. How many results are returned?

Alternative server: aflowlib.duke.edu/search/ui/

R. H. Taylor *et al.*, *Comput. Mater. Sci.* **93**, 178-192 (2014), F. Rose *et al.*, *Comput. Mater. Sci.* **137**, 362 (2017) ; M. Esters *et al.*, *Comput. Mater. Sci.* **216**, 111808 (2023)

AFLOW.org Search Page

Live demo examples:

1. Let us use the advanced search functionality to find the band gap for SiC in the zincblende structure (space group number 216). → **1.37 eV**
2. Let us use the advanced search functionality to find the materials containing Sn but not Pb with band gaps between 1 eV and 3 eV in the ICSD catalog of the AFLOW database. How many results are returned? → **369 results**

Alternative server: aflowlib.duke.edu/search/ui/

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AFLOW.org Search Page

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Entry page for each item of the database

R. H. Taylor *et al.*, *Comput. Mater. Sci.* **93**, 178-192 (2014), F. Rose *et al.*, *Comput. Mater. Sci.* **137**, 362 (2017) ; M. Esters *et al.*, *Comput. Mater. Sci.* **216**, 111808 (2023)

AFLOW Software & Apps at aflow.org

AFLOW

Automatic - FLOW for Materials Discovery

S. Curtarolo *et al.*, *Comput. Mater. Sci.* **58**, 218 (2012)

- written in C++ utilizing VASP as density functional theory program
- AFLOW standard for:
 - *k*-point sets
 - plane wave cutoffs
 - PAW data sets ...

C. E. Calderon *et al.*, *Comput. Mater. Sci.* **108**, 233 (2015)



G. Kresse and J. Hafner, *Phys. Rev. B* **49**, 14251 (1994)

G. Kresse and J. Furthmüller, *Phys. Rev. B* **54**, 11169 (1996)

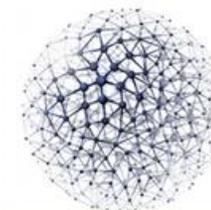
G. Kresse and J. Furthmüller, *Comput. Mater. Sci.* **6**, 15 (1996)

MendeLIB search



AFLOW database search application

AFLOW-online



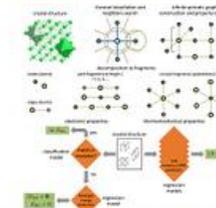
Online interface for AFLOW's symmetry, structure comparison, CCE, POCC, and other functionality

Prototype encyclopedia



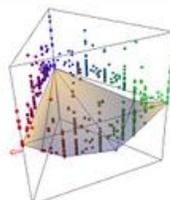
The AFLOW Prototype Encyclopedia with over 1,100 prototypes

AFLOW-ML



Machine Learning application for the PLMF, MDF, and ASC model

AFLOW-CHULL



Convex HULL application for thermodynamic stability and synthesizability

REST-API Docs



Documentation for the AFLOW REST-API

➤ the AFLOW software is structured into purpose dedicated, fully interoperable modules