

OPTIMADE: A Common REST API for Materials Databases Interoperability

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Materials advances are

one of the key drivers of innovation...



faster computers



more compact energy storage



more compact data storage



more efficient solar cells

How can one find materials with targeted properties in the information age?



good transparent conducting material

Google Search

I'm Feeling Lucky

How can one find materials with targeted properties in the information age?



good stability & band gap > 3.2 eV & good carrier mobility

Google Search

I'm Feeling Lucky

However, till recently, very little information was actually known about materials properties

- There are about 50,000 to 70,000 known inorganic compounds but
 - ◆ dielectric constants available only for ~300-400 compounds
 - ◆ elastic constants available only for ~200 compounds
 - ◆ band gaps available only for ~200 compounds
 - ◆ ...



- For almost every property we are below 1% coverage



or



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13

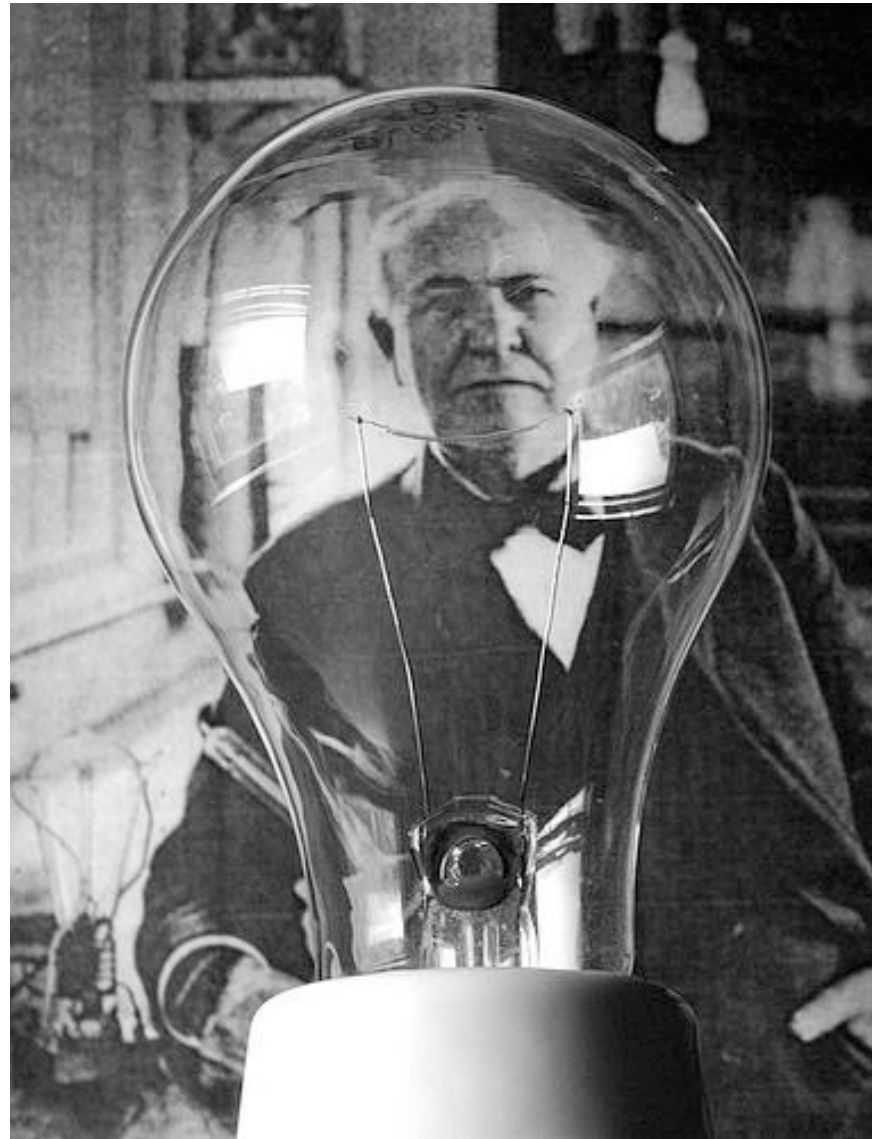


**In fact, materials designers often
operate almost in the dark!**



Experimental materials design

mainly proceeds by trial and error

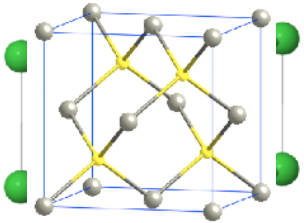


Ab initio calculations have reached the required maturity for high-throughput materials screening

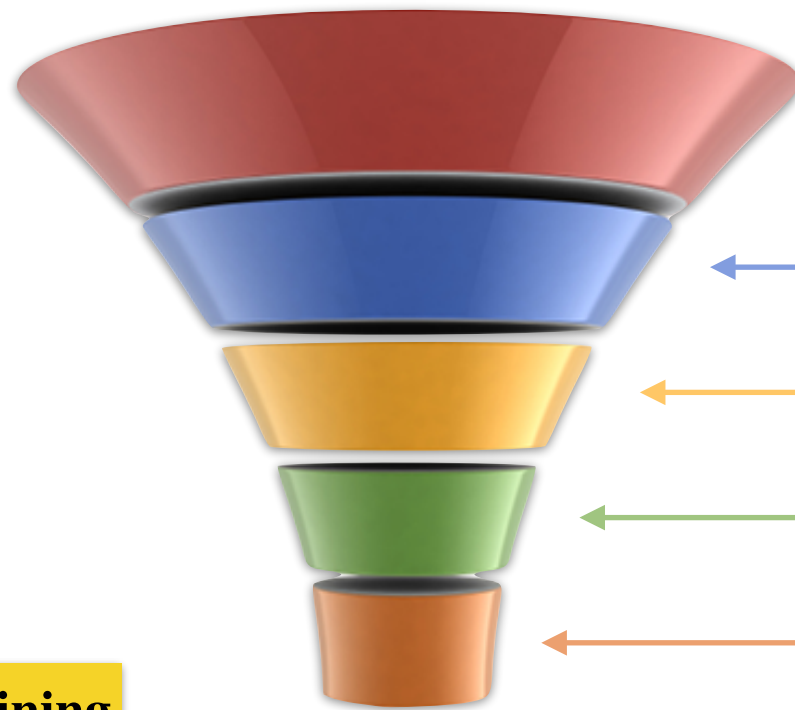


High-throughput *ab initio* materials design

Consider as many compounds as possible, typically $O(10^3) \rightarrow O(10^5)$



Data-Mining



High-throughput



property 1



property 2



property 3



property 4

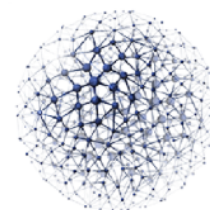


property 5



$O(10^1) \rightarrow O(10^2)$ compounds

Thanks to such HT calculations, many materials DB have become available online

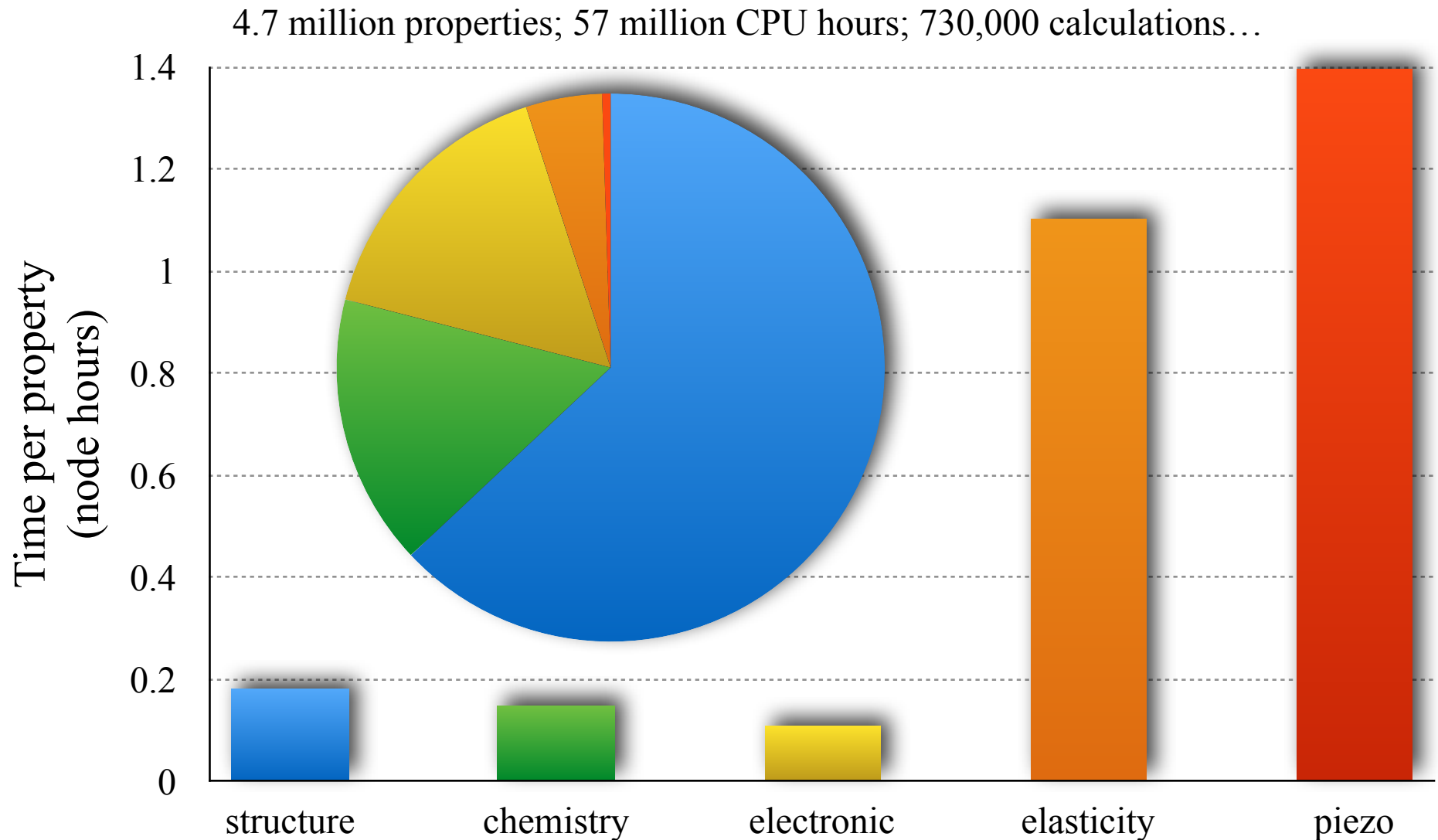


AFLOW



Predicting different properties requires

very different computing time



(Big) data and machine learning

are revolutionizing materials science



1st paradigm:
Empirical science

Experiments

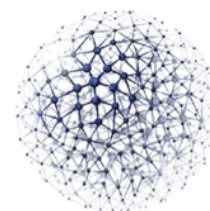
1600

1950

2000

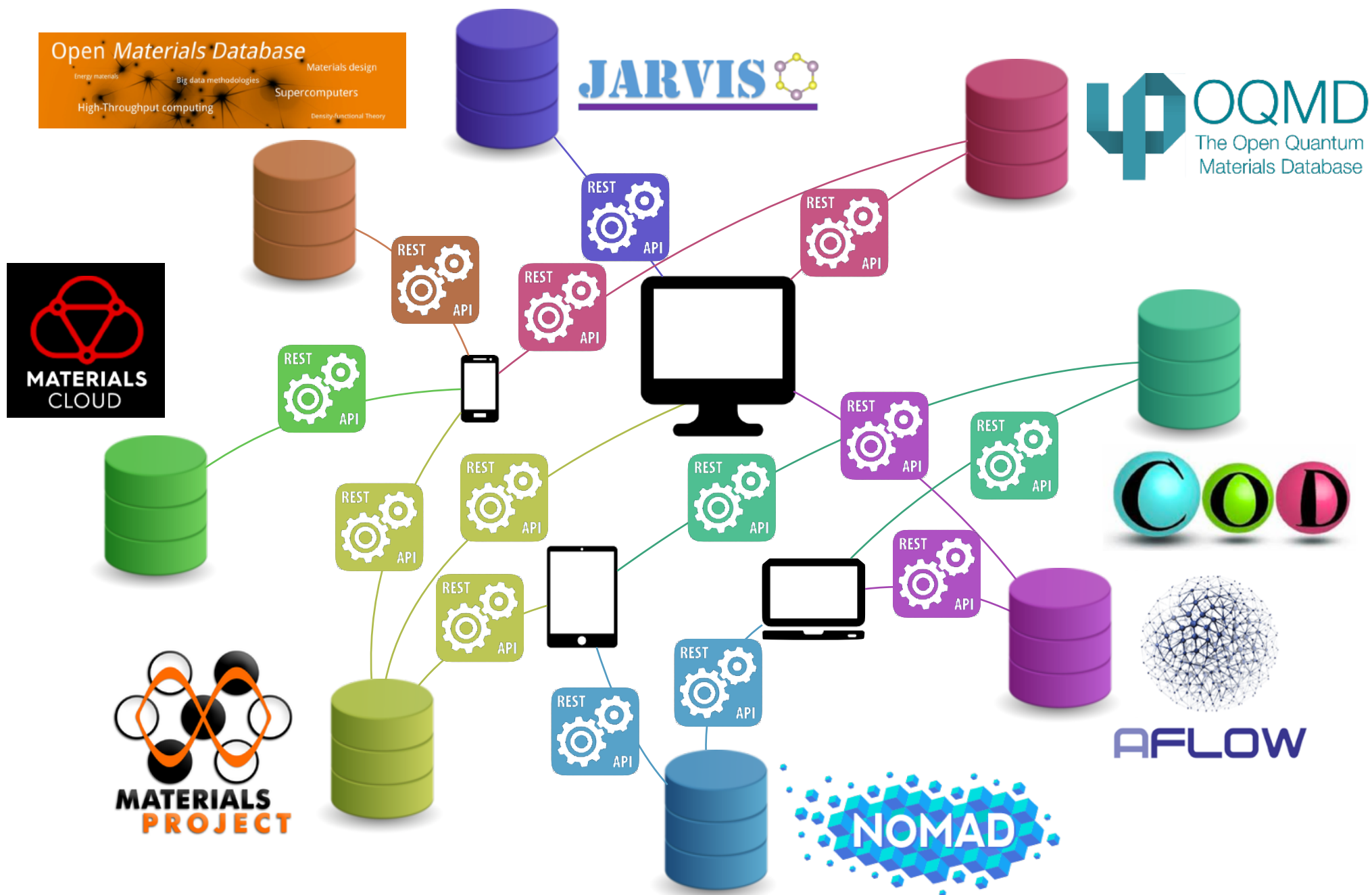


Materials design will require to take advantage of ALL the DB available online



Each of these databases has

its own user base and specific API



Query examples



<http://www.crystallography.net/cod/result.php?formula=O2%20Si>



[http://www.materialsproject.org/rest/v2/materials/SiO2/vasp/structure?
API_KEY=YOUR_API_KEY](http://www.materialsproject.org/rest/v2/materials/SiO2/vasp/structure?API_KEY=YOUR_API_KEY)



[http://afowlib.duke.edu/search/API/?species\(Si,O\),nspecies\(2\)](http://afowlib.duke.edu/search/API/?species(Si,O),nspecies(2))

Query examples



<http://www.materialsproject.org/rest/v2/materials/SiO2/vasp/structure>



[http://aflow.org/API/aflux/?compound\(SiO2\)](http://aflow.org/API/aflux/?compound(SiO2))

This returns no response...

Query examples



<http://www.crystallography.net/cod/result.php?formula=O2%20Si>



[http://aflow.org/API/aflux/?compound\(O2Si1\)](http://aflow.org/API/aflux/?compound(O2Si1))

This returns entries where the unit cell is SiO_2 , but it does not return Si_2O_4 or simulation cells containing more formula units...

Response examples



- <http://www.crystallography.net/cod/result.php?formula=O2%20Si>

Search results

Result: there are 239 entries in the selection

[Switch to the old layout of the page](#)

Download all results as: [list of COD numbers](#) | [list of CIF URLs](#) | [data in CSV format](#) | [archive of CIF files \(ZIP\)](#)

Searching formula like 'O2 Si'

◀◀ First | ◀ Previous 20 | Page 1 of 12 | Next 20 ▶▶ | Last ▶▶▶ | Display 5 20 50 100 200 300 500 1000 entries per page

COD ID ▲	Links	Formula ▲	Space group ▲	Cell parameters	Cell volume ▲	Bibliography
1010921	CIF	O2 Si	P 21 3	7.16; 7.16; 7.16 90; 90; 90	367.1	Barth, T F W The Cristobalite Structures. I. High-Cristobalite <i>American Journal of Science, Serie 5(1,1921-1938)</i> , 1932 , <i>23</i> , 350-356
1010938	CIF	O2 Si	P 41 21 2	4.964; 4.964; 6.92 90; 90; 90	170.5	Nieuwenkamp, W Die Kristallstruktur des Tief-Cristobalits Si O2 <i>Zeitschrift fuer Kristallographie, Kristallgeometrie, Kristallphysik, Kristallchemie (-144,1977)</i> , 1935 , <i>92</i> , 82-88
1010944	CIF	O2 Si	F d -3 m :1	7.12; 7.12; 7.12 90; 90; 90	360.9	Wyckoff, Ralph W. G. IX. Die Kristallstruktur von β-Cristobalit SiO~2~ (bei hohen Temperaturen stabile Form) <i>Zeitschrift fuer Kristallographie, Kristallgeometrie, Kristallphysik, Kristallchemie (-144,1977)</i> , 1925 , <i>62</i> , 189-200
1010954	CIF	O2 Si	F 41 3 2	7.12; 7.12; 7.12 90; 90; 90	360.9	Wyckoff, R W G The crystal structure of the high temperature form of Cristobalite (Si O2) <i>American Journal of Science, Serie 5(1,1921-1938)</i> , 1925 , <i>9</i> , 448-459
1011097	CIF	O2 Si	P 31 2 1	4.913; 4.913; 5.404 90; 90; 120	113	Wei, P. H. Die Bindung im Quarz <i>Zeitschrift fuer Kristallographie, Kristallgeometrie, Kristallphysik, Kristallchemie (-144,1977)</i> , 1935 , <i>92</i> , 355-362
1011159	CIF	O2 Si	P 32 2 1 S	4.91; 4.91; 5.4 90; 90; 120	112.7	Machatschki, F Kristallstruktur von Tiefquarz <i>Fortschritte der Mineralogie</i> , 1936 , <i>20</i> , 45-47
1011172	CIF	O2 Si	P 31 2 1	4.913; 4.913; 5.405 90; 90; 120	113	Brill, R; Hermann, C; Peters, C Studien ueber chemische Bindung mittels Fourieranalyse III. Die Bindung im Quarz <i>Naturwissenschaften</i> , 1939 , <i>27</i> , 676-677
1011176	CIF	O2 Si	P 32 2 1 S	4.9; 4.9; 5.4 90; 90; 120	112.3	Machatschki, F Die Kristallstruktur von Tiefquarz Si O2 und Aluminiumorthoarsenat Al As O4 <i>Zeitschrift fuer Kristallographie, Kristallgeometrie, Kristallphysik, Kristallchemie (-144,1977)</i> , 1936 , <i>94</i> , 222-230
1011200	CIF	O2 Si	P 62 2 2	5.013; 5.013; 5.47 90; 90; 120	119	Wyckoff, Ralph W. G. XXIX. Kriterien für hexagonale Raumgruppen und die Kristallstruktur von β-quarz <i>Zeitschrift fuer Kristallographie, Kristallgeometrie, Kristallphysik, Kristallchemie (-144,1977)</i> , 1926 , <i>63</i> , 507-537
1505106	CIF	O2 Si	P 1 21/n 1	13.382; 20.125; 19.89	5356	Schmidt, Wolfgang; Wilczok, Ursula; Weidenthaler, Claudia; Medenbach, Olaf; Goddard, Richard; Buth, Gernot; Cepak,

Response examples



- <http://www.crystallography.net/cod/result.php?formula=O2%20Si&format=json>

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Response examples

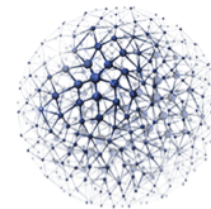


- <http://www.materialsproject.org/rest/v2/materials/SiO2/vasp/structure>

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Response examples



AFLow

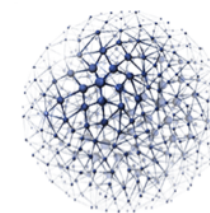
- [http://afloplib.duke.edu/search/API/?compound\(O2Si1\)](http://afloplib.duke.edu/search/API/?compound(O2Si1))

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[{"compound": "O2Si1", "aid": "aflow:cb11950759a0a497", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/FCC/O2Si1_ICSD_44271"}]
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- [http://afloplib.duke.edu/search/API/?species\(Si,O\),nspecies\(2\)](http://afloplib.duke.edu/search/API/?species(Si,O),nspecies(2))

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[{"compound": "O16Si8", "aid": "aflow:590a543e005fcdd0", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_170533", "species": "O,Si", "nspecies": "2"}, {"compound": "O8Si4", "aid": "aflow:fe6cb4a748ca8f04", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_75649", "species": "O,Si", "nspecies": "2"}, {"compound": "O48Si24", "aid": "aflow:a461b6af4b750e1c", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_94091", "species": "O,Si", "nspecies": "2"}, {"compound": "O24Si12", "aid": "aflow:3dd0d3cf29cc4b04", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_56684", "species": "O,Si", "nspecies": "2"}, {"compound": "O16Si8", "aid": "aflow:390c258fcaala88b", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_170535", "species": "O,Si", "nspecies": "2"}, {"compound": "O16Si8", "aid": "aflow:a75642571911e18e", "aurl": "afloplib.duke.edu:AFLOWDATA/ICSD_WEB/ORC/O2Si1_ICSD_170546", "species": "O,Si", "nspecies": "2"}, {"compound": "O16Si8", 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Response examples



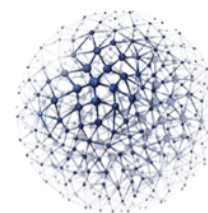
AFLOW

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▶ 3:	{...}	
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JSON	Raw Data	Headers
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Response examples

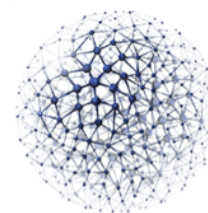


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JSON	Raw Data	Headers
Save	Copy	Collapse All
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JSON	Raw Data	Headers
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Response examples



JSON	Raw Data	Headers
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sig_c:		null
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beta:		"90"
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gamma:		"90"
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vol:		"367.1"
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diff_rtemp:		null
sig_diff_rtemp:		null
cellpressure:		null
sig_cellpressure:		null
diff_pressure:		null
sig_diff_pressure:		null
thermalhist:		null
pressurehist:		null
compoundsource:		null
nel:		"2"
sg:		"P 21 3"

JSON	Raw Data	Headers
JSON	Copy	Collapse All
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@class:		"Structure"
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▼ lattice:		
▶ matrix:		
a:		9.01708962
b:		9.01708962
c:		9.01708962
alpha:		90
beta:		90
gamma:		90
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▼ 0:		
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element:		"Si"
occu:		1
▼ abc:		
0:		0.25
1:		0.5
2:		0
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0:		2.254272405
1:		4.50854481

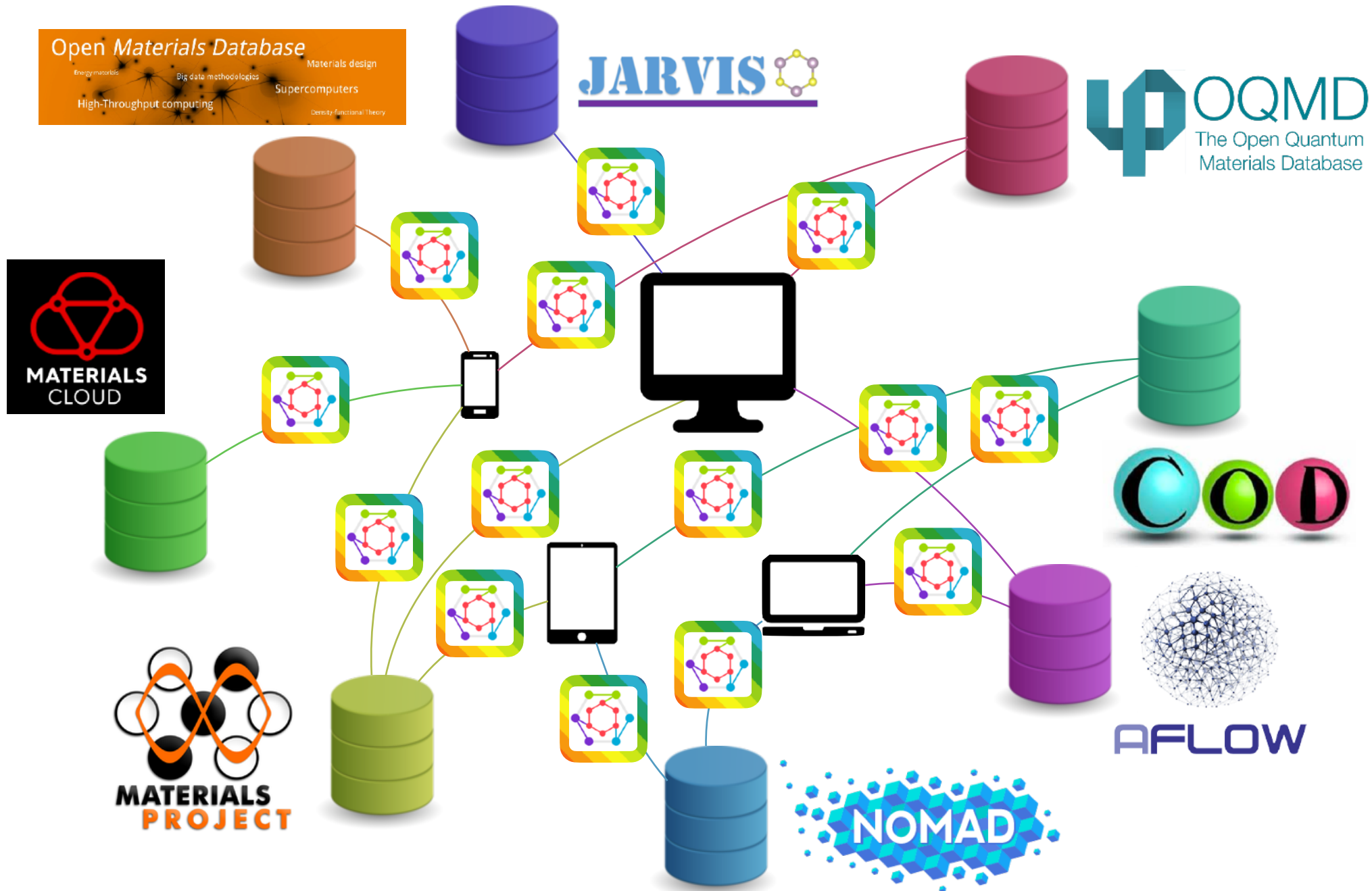
JSON	Raw Data	Headers	
Save	Copy	Collapse All	Expand All
▼ 0:			
compound:		"016Si8"	
aid:		"afLOW:590a543e005fcdd0"	
▼ aurl:			
species:		"0,Si"	
nspecies:		"2"	
▼ 1:			
compound:		"08Si4"	
aid:		"afLOW:fe6cb4a748ca8f04"	
▼ aurl:			
species:		"0,Si"	
nspecies:		"2"	
▼ 2:			
compound:		"048Si24"	
aid:		"afLOW:a461b6af4b750e1c"	
▼ aurl:			
species:		"0,Si"	
nspecies:		"2"	
▼ 3:			
compound:		"024Si12"	
aid:		"afLOW:3dd0d3cf29cc4b04"	
▼ aurl:			
species:		"0,Si"	
nspecies:		"2"	
▼ 4:			
compound:		"016Si8"	
aid:		"afLOW:390c258fcaa1a88b"	
▼ aurl:			
species:		"0,Si"	

Discussions lead to define a common API

- The initial release was developed by the participants of the workshops “Open Databases Integration for Materials Design” held at:
 - ◆ the Lorentz Center (October 2016)
 - ◆ the CECAM (June 2018, 2019, 2020, and 2021)



The users are now able to search more materials DBs with the same query...



The users are now able to search

more materials DBs with the same query...

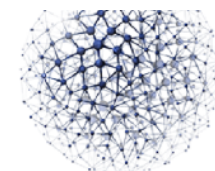
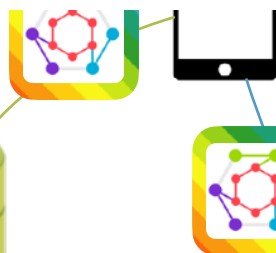
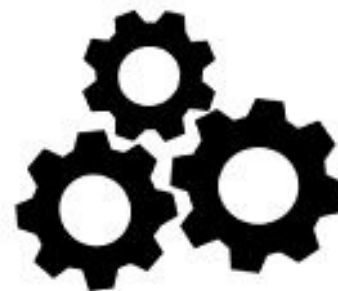


F
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A
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I
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R
eusable



AFLOW

The users are now able to search

more materials DBs with the same query...

- The philosophy of the OPTIMADE query is to enable the structural formula to be specified in a straightforward and intuitive manner.
- The query about SiO₂ can each be performed on standardized, versioned endpoints (**/v1/structures**) that permit a common filter format with well-defined terms (**?filter=chemical_formula_reduced="O2Si"**):

`<optimade_impl_url>/v1/structures?filter=chemical_formula_reduced="O2Si"`

- Furthermore, the response format is exactly the same!

The users are now able to search more materials DBs with the same query...

- If we explore Group 14 compounds, we can write a simple query (1):

`/v1/structures?filter=elements HAS ANY "C", "Si", "Ge", "Sn", "Pb"`

- We can further focus on binary materials (2):

`/v1/structures?filter=elements HAS ANY "C", "Si", "Ge", "Sn", "Pb" AND nelements=2`

- We can discard one element (e.g., Pb) focusing on ternary materials (3):

`/v1/structures?filter=elements HAS ANY "C", "Si", "Ge", "Sn" AND NOT elements HAS "Pb"`

`AND elements LENGTH 3`

Provider	N ₁	N ₂	N ₃
AFLOW	700,192	62,293	382,554
Crystallography Open Database (COD)	416,314	3,896	32,420
Theoretical Crystallography Open Database (TCOD)	2,631	296	660
Materials Cloud	886,518	801,382	103,075
Materials Project	27,309	3,545	10,501
Novel Materials Discovery Laboratory (NOMAD)	3,359,594	532,123	1,611,302
Open Database of Xtals (odbx)	55	54	0
Open Materials Database (<i>omdb</i>)	19,317	396	3,303
Open Quantum Materials Database (OQMD)	153,113	11,011	70,252

Further databases are known to have partial implementations of the OPTIMADE API, including JARVIS.

Computational data ▾

ELEMENTS

SYSTEM

METHOD

PROPERTIES

UPLOADS

Entries ▾

Search with Optimade filter language

OPTIMADE elements HAS ANY "Al", "Ga", "In"

There are 1,394,894 entries left.

only composition that exclusively contain these atoms

1 H 20,817																	2 He 0	
3 Li 50,422	4 Be 47,716											5 B 34,282	6 C 10,033	7 N 26,727	8 O 27,890	9 F 13,901	10 Ne 0	
11 Na 49,456	12 Mg 52,643											13 Al 531,937	14 Si 44,787	15 P 58,075	16 S 8,622	17 Cl 40,349	18 Ar 3	
19 K 49,330	20 Ca 49,531	21 Sc 50,792	22 Ti 59,571	23 V 56,131	24 Cr 50,906	25 Mn 51,315	26 Fe 56,491	27 Co 54,240	28 Ni 64,693	29 Cu 64,861	30 Zn 50,091	31 Ga 465,991	32 Ge 33,876	33 As 50,080	34 Se 33,849	35 Br 37,261	36 Kr 0	
37 Rb 3,373	38 Sr 51,579	39 Y 51,824	40 Zr 56,914	41 Nb 50,279	42 Mo 50,132	43 Tc 48,716	44 Ru 50,598	45 Rh 50,796	46 Pd 52,222	47 Ag 49,943	48 Cd 50,005	49 In 449,786	50 Sn 49,733	51 Sb 46,908	52 Te 34,081	53 I 1,993	54 Xe 0	
55 Cs 3,397	56 Ba 49,249			72 Hf 51,314	73 Ta 50,591	74 W 49,954	75 Re 49,529	76 Os 50,306	77 Ir 50,352	78 Pt 51,803	79 Au 50,603	80 Hg 49,517	81 Tl 49,128	82 Pb 49,779	83 Bi 49,329	84 Po 0	85 At 0	86 Rn 0
87 Fr 0	88 Ra 0	104 Rf 0	105 Db 0	106 Sg 0	107 Bh 0	108 Hs 0	109 Mt 0	110 Ds 0	111 Rg 0	112 Cn 0	113 Nh 0	114 Fl 0	115 Mc 0	116 Lv 0	117 Ts 0	118 Og 0		
119 Uue 0																		
		57 La 49,950	58 Ce 2,394	59 Pr 1,545	60 Nd 2,065	61 Pm 1,121	62 Sm 2,000	63 Eu 1,922	64 Gd 2,109	65 Tb 1,412	66 Dy 1,936	67 Ho 1,632	68 Er 1,675	69 Tm 1,667	70 Yb 1,341	71 Lu 1,464		
		89 Ac 1,102	90 Th 1,678	91 Pa 1,659	92 U 1,918	93 Np 1,711	94 Pu 1,609	95 Am 0	96 Cm 0	97 Bk 0	98 Cf 0	99 Es 0	100 Fm 0	101 Md 0	102 No 0	103 Lr 0		

ENTRIES

MATERIALS

GROUPED ENTRIES

DATASETS

1,394,894 entries

Computational data ▾

ELEMENTS

SYSTEM

METHOD

PROPERTIES

UPLOADS

Entries ▾

Search with Optimade filter language

OPTIMADE elements HAS ANY "Al", "Ga", "In" AND nelements=2

There are 191,626 entries left.

only composition that exclusively contain these atoms

1 H 10,074																	2 He 0		
3 Li 1,200	4 Be 1,105											5 B 1,334	6 C 1,912	7 N 21,078	8 O 4,720	9 F 8,101	10 Ne 0		
11 Na 960	12 Mg 3,726											13 Al 82,744	14 Si 1,266	15 P 20,051	16 S 2,554	17 Cl 6,726	18 Ar 3		
19 K 1,064	20 Ca 1,083	21 Sc 1,319	22 Ti 3,031	23 V 1,128	24 Cr 1,286	25 Mn 1,564	26 Fe 3,255	27 Co 1,793	28 Ni 3,304	29 Cu 1,604	30 Zn 1,189	31 Ga 60,001	32 Ge 1,180	33 As 15,886	34 Se 1,487	35 Br 1,230	36 Kr 0		
37 Rb 192	38 Sr 1,136	39 Y 1,428	40 Zr 1,268	41 Nb 1,363	42 Mo 1,328	43 Tc 1,053	44 Ru 1,343	45 Rh 1,473	46 Pd 1,727	47 Ag 3,233	48 Cd 1,386	49 In 43,872	50 Sn 1,292	51 Sb 14,531	52 Te 1,265	53 I 304	54 Xe 0		
55 Cs 189	56 Ba 1,150			72 Hf 1,683	73 Ta 1,387	74 W 1,134	75 Re 1,220	76 Os 1,312	77 Ir 1,372	78 Pt 1,663	79 Au 1,477	80 Hg 1,394	81 Tl 1,080	82 Pb 1,224	83 Bi 1,673	84 Po 0	85 At 0	86 Rn 0	
87 Fr 0	88 Ra 0			104 Rf 0	105 Db 0	106 Sg 0	107 Bh 0	108 Hs 0	109 Mt 0	110 Ds 0	111 Rg 0	112 Cn 0	113 Nh 0	114 Fl 0	115 Mc 0	116 Lv 0	117 Ts 0	118 Og 0	
119 Uue 0																			
			57 La 1,315	58 Ce 257	59 Pr 258	60 Nd 213	61 Pm 147	62 Sm 221	63 Eu 298	64 Gd 241	65 Tb 183	66 Dy 249	67 Ho 199	68 Er 185	69 Tm 181	70 Yb 218	71 Lu 162		
			89 Ac 161	90 Th 241	91 Pa 156	92 U 234	93 Np 215	94 Pu 300	95 Am 0	96 Cm 0	97 Bk 0	98 Cf 0	99 Es 0	100 Fm 0	101 Md 0	102 No 0	103 Lr 0		

ENTRIES

MATERIALS

GROUPED ENTRIES

DATASETS

191,626 entries

Computational data ▾

ELEMENTS

SYSTEM

METHOD

PROPERTIES

UPLOADS

Entries ▾

Search with Optimade filter language

OPTIMADE elements HAS ANY "Al", "Ga", "In" AND elements HAS ANY "N", "P", "As", "Sb" AND nelements=2

There are 71,546 entries left.

only composition that exclusively contain these atoms

1 H 0																	2 He 0	
3 Li 0	4 Be 0											5 B 0	6 C 0	7 N 21,078	8 O 0	9 F 0	10 Ne 0	
11 Na 0	12 Mg 0											13 Al 21,742	14 Si 0	15 P 20,051	16 S 0	17 Cl 0	18 Ar 0	
19 K 0	20 Ca 0	21 Sc 0	22 Ti 0	23 V 0	24 Cr 0	25 Mn 0	26 Fe 0	27 Co 0	28 Ni 0	29 Cu 0	30 Zn 0	31 Ga 30,008	32 Ge 0	33 As 15,886	34 Se 0	35 Br 0	36 Kr 0	
37 Rb 0	38 Sr 0	39 Y 0	40 Zr 0	41 Nb 0	42 Mo 0	43 Tc 0	44 Ru 0	45 Rh 0	46 Pd 0	47 Ag 0	48 Cd 0	49 In 19,796	50 Sn 0	51 Sb 14,531	52 Te 0	53 I 0	54 Xe 0	
55 Cs 0	56 Ba 0			72 Hf 0	73 Ta 0	74 W 0	75 Re 0	76 Os 0	77 Ir 0	78 Pt 0	79 Au 0	80 Hg 0	81 Tl 0	82 Pb 0	83 Bi 0	84 Po 0	85 At 0	86 Rn 0
87 Fr 0	88 Ra 0			104 Rf 0	105 Db 0	106 Sg 0	107 Bh 0	108 Hs 0	109 Mt 0	110 Ds 0	111 Rg 0	112 Cn 0	113 Nh 0	114 Fl 0	115 Mc 0	116 Lv 0	117 Ts 0	118 Og 0
119 Uue 0																		
		57 La 0	58 Ce 0	59 Pr 0	60 Nd 0	61 Pm 0	62 Sm 0	63 Eu 0	64 Gd 0	65 Tb 0	66 Dy 0	67 Ho 0	68 Er 0	69 Tm 0	70 Yb 0	71 Lu 0		
		89 Ac 0	90 Th 0	91 Pa 0	92 U 0	93 Np 0	94 Pu 0	95 Am 0	96 Cm 0	97 Bk 0	98 Cf 0	99 Es 0	100 Fm 0	101 Md 0	102 No 0	103 Lr 0		

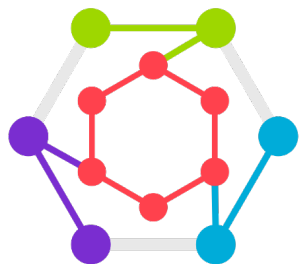
ENTRIES

MATERIALS

GROUPED ENTRIES

DATASETS

71,546 entries



OPTIMADE v1.0 (released July 2020)

- **REST API for common access to crystal structure databases**
 - ◆ Human-readable specification (~20k words)
 - ◆ Based on JSON API
 - ◆ Machine-readable OpenAPI 3.0 schema
- **Enables unified access to 25M crystal structures from 14 providers**
 - ◆ Federated providers list and discoverability mechanisms
 - ◆ API validation beyond OpenAPI through associated tooling
- **Features:**
 - ◆ Standardized representation for crystal structures, bibliographic references and links
 - ◆ Well-defined grammar/filter language
 - ◆ Introspective **/info** endpoint for extensibility
 - ◆ Strict response format, but data models are flexible where necessary

scientific **data**



OPEN
ARTICLE

OPTIMADE, an API for exchanging materials data

Casper W. Andersen *et al.*[#]

The Open Databases Integration for Materials Design (OPTIMADE) consortium has designed a universal application programming interface (API) to make materials databases accessible and interoperable. We outline the first stable release of the specification, v1.0, which is already supported by many leading databases and several software packages. We illustrate the advantages of the OPTIMADE API through worked examples on each of the public materials databases that support the full API specification.

[#]A full list of authors and their affiliations appears at the end of the paper.

/optimade/providers



OPTIMADE Providers Index Meta-Database

The list of OPTIMADE providers keeps track of all reserved database-specific prefixes and the URLs to the index databases of all OPTIMADE database providers that participate in the [OPTIMADE network](#).

The list of providers is published in the form of a statically hosted OPTIMADE Index Meta-Database here:

- <https://providers.optimade.org/>

If you specifically seek the current list of providers for the latest version of the OPTIMADE specification, you can access it at this URL:

- <https://providers.optimade.org/providers.json>

If you seek the list of providers formatted according to a specific major version of the OPTIMADE specification, you can access it using this URL:

- <https://providers.optimade.org/<version>/links>

Where `<version>` designates a major version name of the OPTIMADE specification, e.g., `v1`.

Repository organization

The OPTIMADE providers repository is hosted here: <https://github.com/Materials-Consortia/providers>

The repository is organized this way:

- `/src/links/<version>/providers.json` is the current providers.json file formatted according to OPTIMADE version `<version>` and any later version that uses a format that is backward compatible with this version.
- `/src/info/<version>/info.json` is the proper response to the info endpoint formatted according to OPTIMADE version `<version>` and any later version that uses a format that is backward compatible with this version.
- `/_redirect` specify http rewrites to map index meta-database URLs `/<version>/info` and `/<version>/links` to the corresponding files under `src/`, as well as `/providers.json`.

/optimade/providers

JSON Raw Data Headers

Save Copy Collapse All Expand All Filter JSON

▼ data:	
▼ 0:	
type:	"provider"
id:	"aiida"
▼ attributes:	
name:	"AiiDA"
▼ description:	"Automated Interactive Infrastructure and Database for Computational Science (AiiDA)"
base_url:	null
homepage:	"http://www.aiida.net"
▼ 1:	
type:	"provider"
id:	"aflow"
▼ attributes:	
name:	"aflow.org"
description:	""
base_url:	null
homepage:	null
▼ 2:	
type:	"provider"
id:	"cod"
▼ attributes:	
name:	"Crystallography Open Database"
▼ description:	"Open-access collection of crystal structures of organic, inorganic, metal-organics compounds and minerals."
base_url:	"https://www.crystallography.net/cod/optimade"
homepage:	"https://www.crystallography.net/cod"
▼ 3:	
type:	"provider"
id:	"exmpl"
▼ attributes:	

/optimade/links

JSON	Raw Data	Headers		
Save	Copy	Collapse All	Expand All	Filter JSON
▼ data:				
▼ 0:				
id:	"autowannier"			
type:	"child"			
▼ attributes:				
name:	"Automated high-throughput Wannierisation"			
▼ description:	"Validation results of an automated protocol for generating maximally-localized Wannier functions in a high-throughput framework."			
▼ base_url:	"https://dev-aiida-dev.materialscloud.org/autowannier/optimade"			
homepage:	"https://materialscloud.org/discover/autowannier"			
▼ 1:				
id:	"curated-cofs"			
type:	"child"			
▼ attributes:				
name:	"CURATED covalent organic frameworks database"			
▼ description:	"Database of experimentally reported Covalent-Organic Frameworks (COFs), provided with DFT-optimized geometry and DDEC partial charges for molecular simulations."			
▼ base_url:	"https://dev-aiida-dev.materialscloud.org/curated-cofs/optimade"			
homepage:	"https://materialscloud.org/discover/curated-cofs"			
▼ 2:				
id:	"optimade-sample"			
type:	"child"			
▼ attributes:				
name:	"OPTIMADE Sample Database"			
▼ description:	"Database with example structures for OPTIMADE tests."			
▼ base_url:	"https://dev-aiida-dev.materialscloud.org/optimade-sample/optimade"			
homepage:	"https://materialscloud.org"			
▼ 3:				
id:	"3dd"			
type:	"child"			
▼ attributes:				
name:	"Three-dimensional crystals database"			
▼ description:	"Curated set of relaxed three-dimensional crystal structures based on raw CIF data from the experimental databases MPDS, COD, and ICSD."			
▼ base_url:	"https://dev-aiida-dev.materialscloud.org/3dd/optimade"			
homepage:	"https://materialscloud.org"			
▼ 4:				
id:	"hcofs-co2"			
type:	"child"			
▼ attributes:				
name:	"COFs for CO2 capture and storage applications"			
▼ description:	"A curated set of COFs with the highest Henry coefficient for CO2, where the full CO2 and N2 isotherm and the parasitic energy for the process have been computed."			



OPTIMADE-Client



OPTIMADE

Open Databases Integration
for Materials Design

Currently valid OPTIMADE API version: `v1.0.0`

Client version: `2020.11.22`

Source code: [GitHub](#)

Help improve the application:

[🐛 Report a bug](#)

[★ Suggest a feature/change](#)

This is a friendly client to search through databases and other implementations exposing an OPTIMADE RESTful API. To get more information about the OPTIMADE API, please see [the official web page](#). All providers are retrieved from [the OPTIMADE consortium's list of providers](#).

Note: The structure property `assemblies` is currently not supported. Follow [the issue on GitHub](#) to learn more.

▶ [FAQ](#)



filter=

- COD v1.0.0
- SSS v1.0.1
- 2DS v1.0.1
- 2DT v1.0.1
- AOT v1.0.1
- TDC v1.0.1
- AHT v1.0.1
- CUR v1.0.1
- OPT v1.0.1
- STO v1.0.1
- PMO v1.0.1
- SSL v1.0.1
- MP v1.0.1
- MPDS v1.0.0
- odbx v1.0.1
- OMD v1.0.0
- TOQ v1.0.0
- TCO v1.0.0



A GitHub repository is available



Open Databases Integration for Materials Design

The Open Databases Integration for Materials Design (OPTIMADE) makes the materials databases interoperational by developing a common REST API.

<http://www.optimade.org>



Repositories 11

Packages

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optimade-python-tools

Tools for implementing and consuming OPTiMaDe APIs in Python

Python MIT 13 stars 10 issues (3 issues need help) 4 forks Updated 9 hours ago



Top languages

Python Shell JavaScript
Java Makefile

optimade-validator-action

GitHub Actions action to validate OPTiMaDe implementations using the validator from Materials-Consortia/optimade-python-tools

Shell MIT 2 stars 1 issue 0 forks Updated yesterday

Most used topics

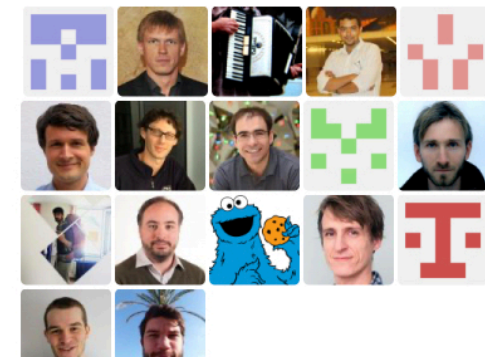
Loading...

materials-consortia.github.io

OPTiMaDe website

JavaScript 3 forks 0 stars 3 issues 1 fork Updated 7 days ago

People



OPTIMADE-Filter

OPTiMaDe filter language parser in Perl

Perl LGPL-3.0 1 fork 0 stars 0 issues 0 forks Updated 7 days ago



jmol-commits Mailing List for Jmol

An interactive viewer for three-dimensional chemical structures.

Brought to you by: [aherraez](#), [egonw](#), [hansonr](#), [migueljmol](#), and [2 others](#)

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jmol-commits

jmol-developers

jmol-users

jmol-commits – Automatic notifications from the CVS repository

[\[Jmol-commits\] SF.net SVN: jmol:\[22399\] trunk/Jmol/src/org/jmol](#)

From: <ha...@us...> - 2022-04-14 04:51:57

Revision: 22399

<http://sourceforge.net/p/jmol/code/22399>

Author: hansonr

Date: 2022-04-14 04:51:53 +0000 (Thu, 14 Apr 2022)

Log Message:

Jmol.___JmolVersion="14.32.48" // also 15.2.48

new feature: Optimade reader

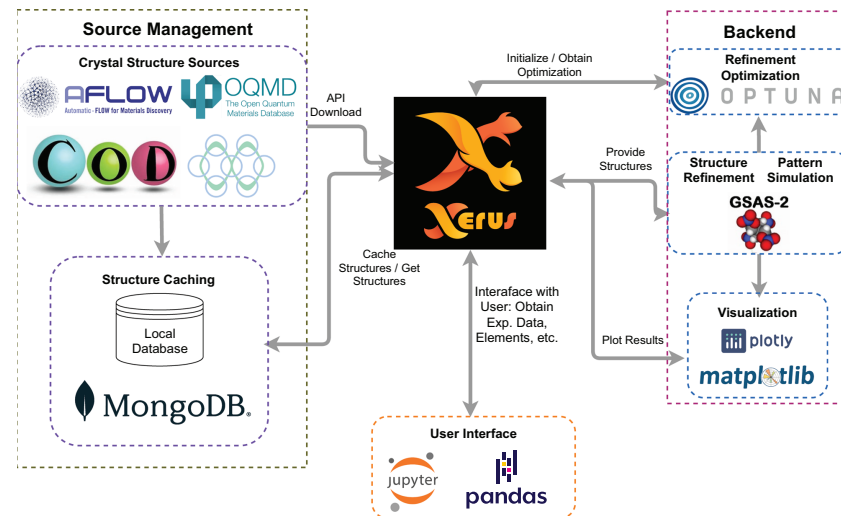
- <https://github.com/Materials-Consortia/OPTIMADE/blob/master/optimade.rst>
- requires qualifier Optimade:: because there is no identifying characteristic of the return
- example: load Optimade::https://optimade.materialsproject.org/v1/structures?filter=nelements=6&page_limit=1

XERUS: An Open-Source Tool for Quick XRD Phase Identification and Refinement Automation

Pedro Baptista de Castro,* Kensei Terashima,* Miren Garbine Esparza Echevarria, Hiroyuki Takeya, and Yoshihiko Takano*

DOI: 10.1002/adts.202100588

Adv. Theory Simul. 2022, 2100588



Search or jump to...



Pull requests Issues Marketplace Explore



pedrobcst / Xerus Public

Watch 2 Fork 1 Star 13

Code Issues 6 Pull requests Actions Projects 2 Wiki Security Insights

master Xerus / Xerus / quierers /

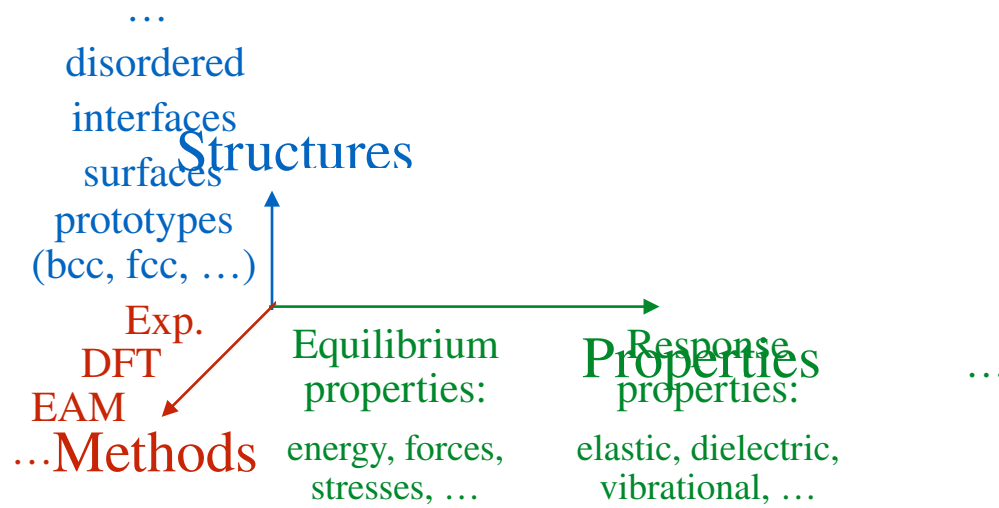
Go to file Add file

pedrobcst Added support for multiple uses querying at same time (experimental..)

7c55464 on Apr 15 History

..		
__init__.py	v1	6 months ago
aflow.py	Added missing header and timeout to OPTIMADE	last month
cod.py	Fix typos from conflict (#15)	2 months ago
mp.py	Set a timeout for requests to avoid infinite hanging	2 months ago
multiquery.py	Added support for multiple uses querying at same time (experimental..)	last month
optimade.py	Added missing header and timeout to OPTIMADE	last month
oqmd.py	Set a timeout for requests to avoid infinite hanging	2 months ago
tcif.py	Added support for multiple uses querying at same time (experimental..)	last month

Opportunities

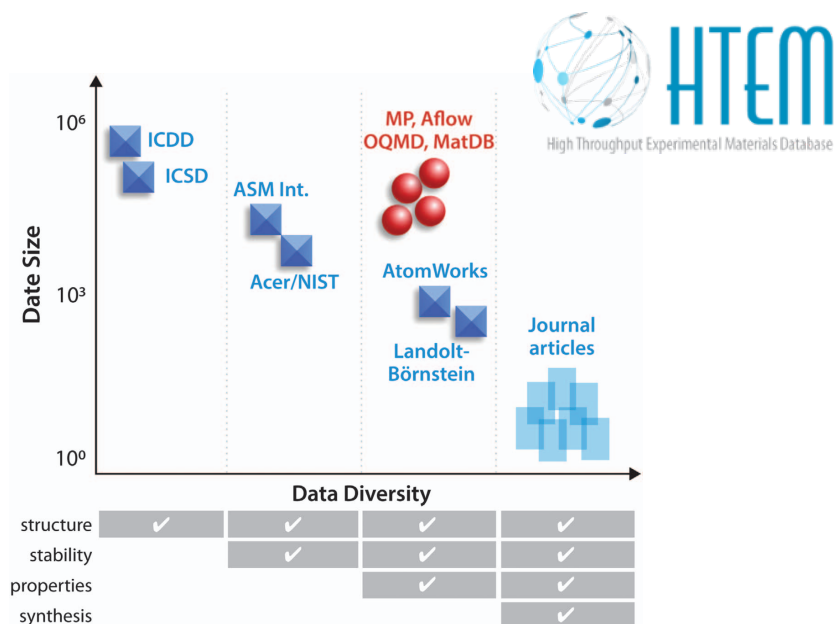
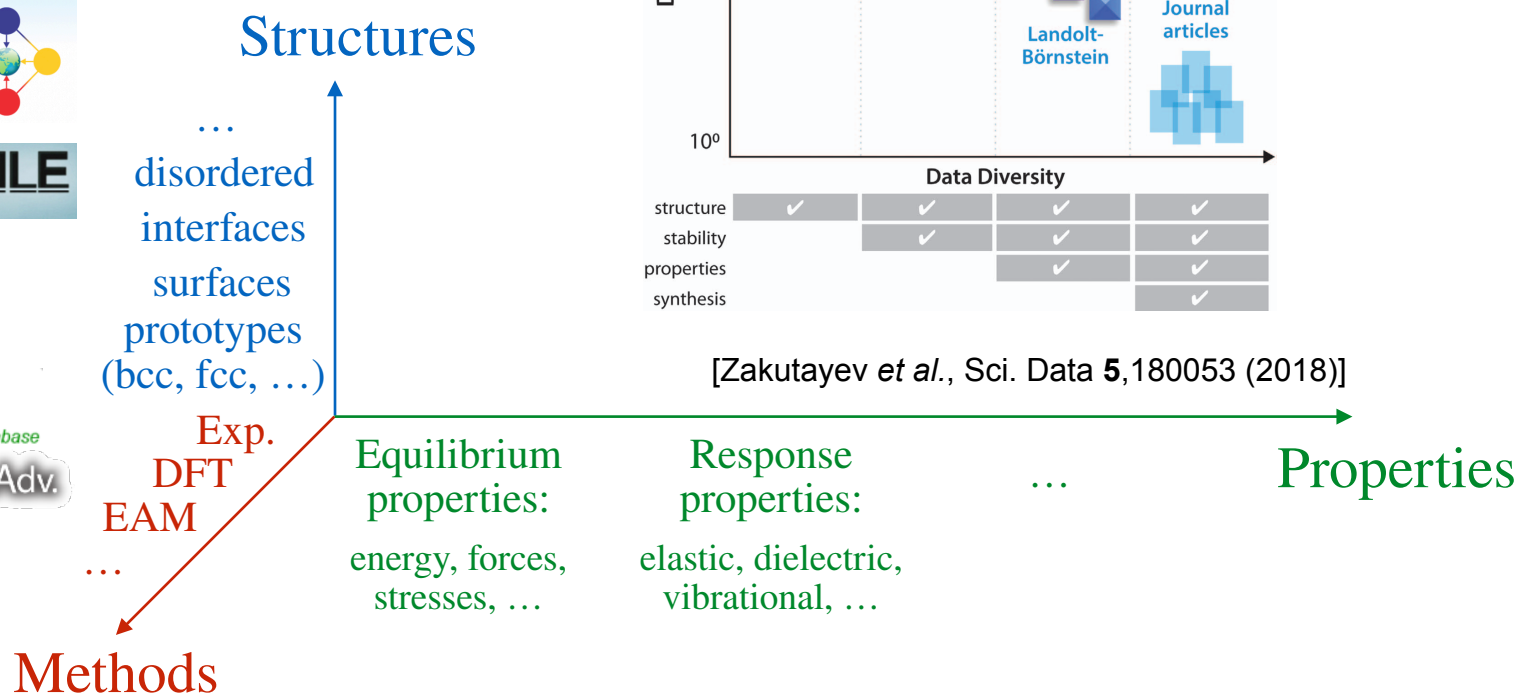


- During the “CECAM brainstorming meeting on Data Driven Science”, which took place at CECAM Headquarters (25 and 26 of March 2019), it was decided that the CECAM would support the OPTIMADE initiative.
- A post-doctoral fellow will be hired for an initial period of 12 months to work on specific tasks dedicated to *expanding the current developments in OPTIMADE to classical molecular dynamics or bio-simulations*
- Longer-term actions:
 - ◆ *creating a service to integrate and interrogate efficiently the different databases*
 - ◆ *creating and maintaining a dictionary of metadata*

Opportunities



GRANTA



[Zakutayev *et al.*, Sci. Data **5**,180053 (2018)]



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HTEM Content

Public version of HTEM DB features composition (37093), structure (47213), optical (26577), and electrical (12849) properties of thin films synthesized using combinatorial methods. It currently contains 1307 sample libraries with 57597 thin film samples, across a wide range of materials (oxides, nitrides, sulfide, intermetallics).



[Search](#)[About](#)[Stats](#)[API](#)

API

Comporting with an open-data ethos, all data in the HTEM DB is available via a RESTful JSON-based API to allow programmatic access. This is the same API that serves as a backend for this website. Those who choose to utilize the API can download data in full to create their own visualizations and analyses beyond what is available here.

Base URI: <https://htem-api.nrel.gov/api>

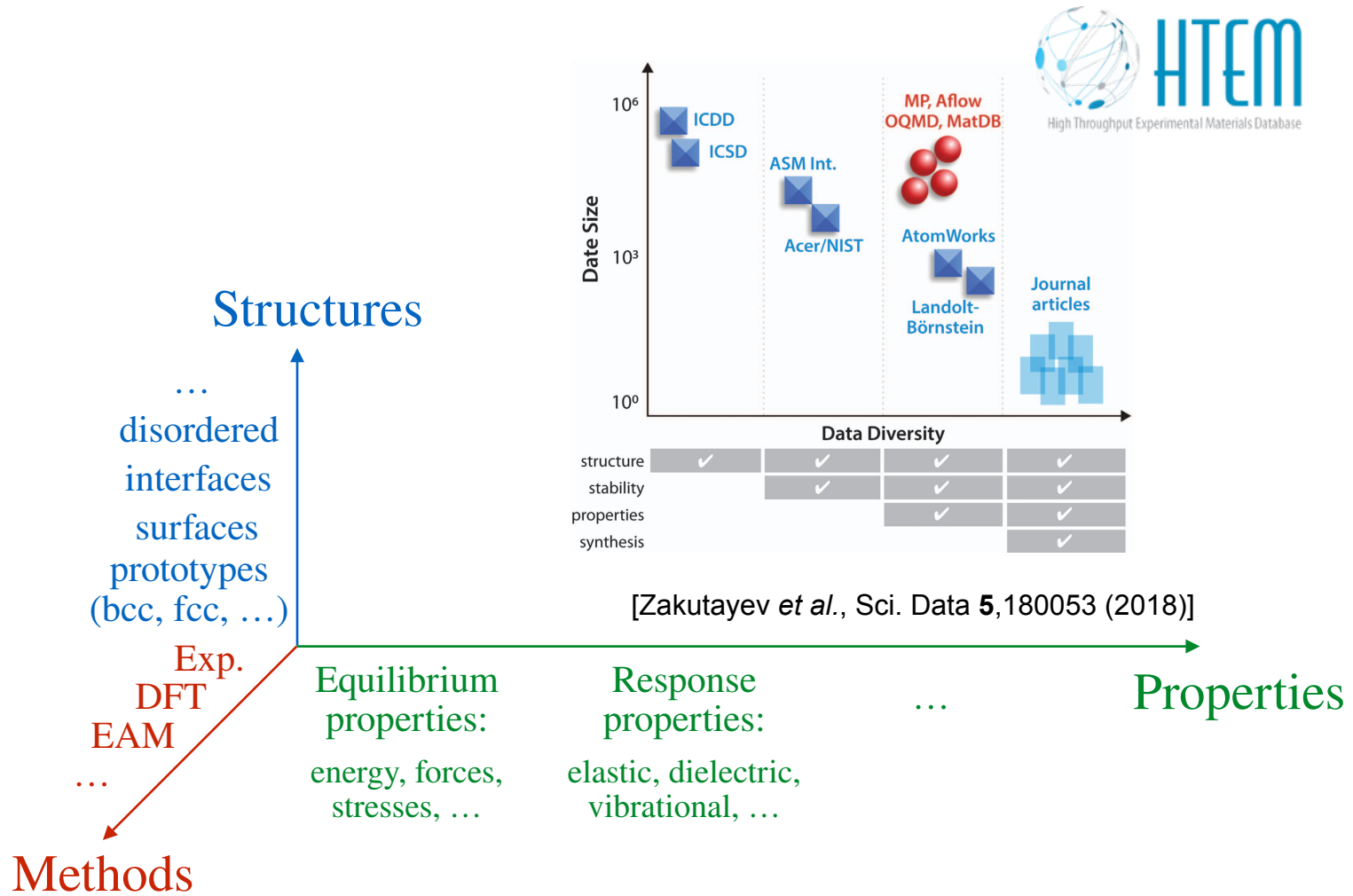
API Documentation: <https://htem-api.nrel.gov/>

If you use our data in your research, please cite its use following the instructions in our [How to Cite](#) page.

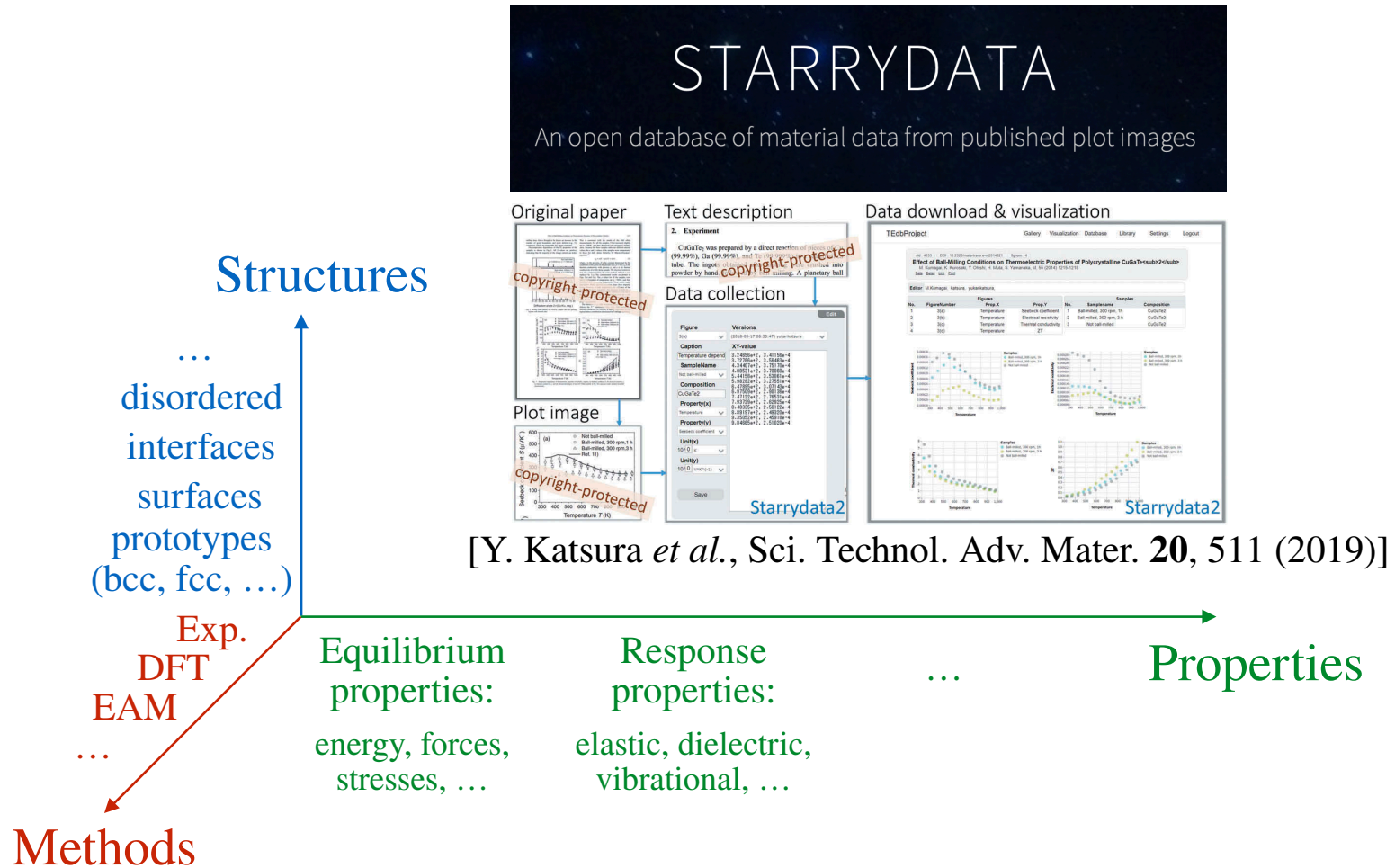


v1.4.3

Opportunities



Opportunities



STARRYDATA

An open database of material data from published plot images

STARRYDATA API

Posted on September 13, 2018 by starrydata in Uncategorized

We have implemented APIs for Starrydata web system.

You can get all data associated to specific paper/figure/sample by the following URIs.

JSON DATA FOR A SPECIFIC PAPERID(='SID')/FIGUREID/SAMPLEID

[https://www.starrydata2.org/api/paper/\(paperid\)](https://www.starrydata2.org/api/paper/(paperid))

[https://www.starrydata2.org/api/figure/\(figureid\)](https://www.starrydata2.org/api/figure/(figureid))

[https://www.starrydata2.org/api/sample/\(sampleid\)](https://www.starrydata2.org/api/sample/(sampleid))

A SPECIFIC ELEMENT OF AN ENTRY

[https://www.starrydata2.org/api/paper/\(paperid\)/title](https://www.starrydata2.org/api/paper/(paperid)/title)

[https://www.starrydata2.org/api/sample/\(sampleid\)/composition](https://www.starrydata2.org/api/sample/(sampleid)/composition)

A LIST OF PAPERIDS/FIGUREIDS/SAMPLEIDS THAT CONTAIN SPECIFIC ATOMS IN THE SAMPLE COMPOSITIONS

<https://www.starrydata2.org/api/paper/search?atom=Bi,Te>

<https://www.starrydata2.org/api/figure/search?atom=Bi,Te>

<https://www.starrydata2.org/api/sample/search?atom=Bi,Te>

<https://www.starrydata2.org/api/search/search?atom=Bi,Te>

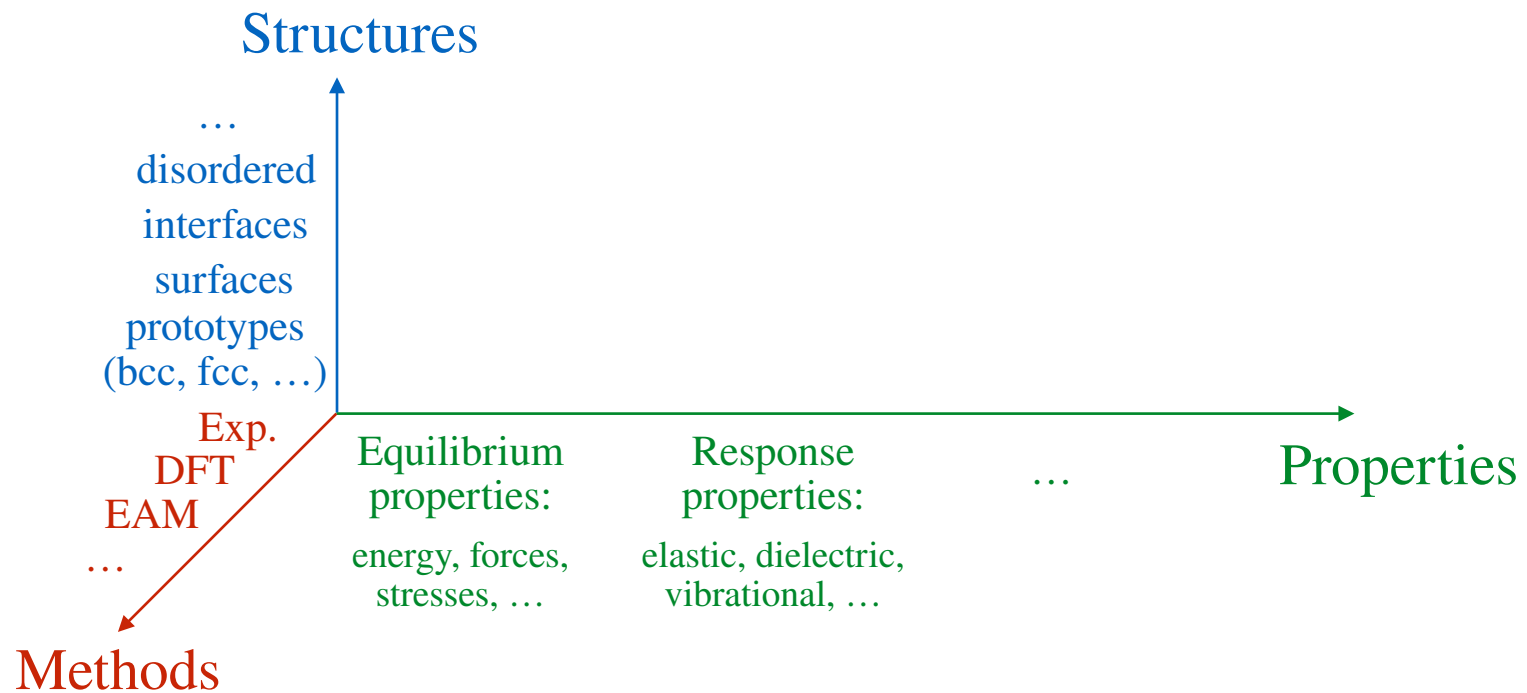
(for a gathered list of paperids, figureids, sampleids)

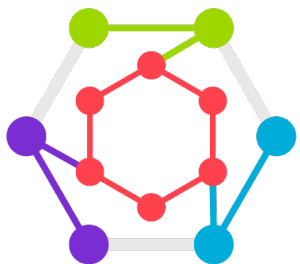
The default is AND search.

OR search can be done by writing 'Bi,Te,or'

Opportunities

- OPTIMADE would clearly benefit from semantically enabling the system using an **ontology**, both for search as well as for integrating information from the underlying databases.





What's next for OPTIMADE?

- **Semantic interoperability through an ontology**

- ◆ "An Ontology for the Materials Design Domain", [arXiv:2006.07712](https://arxiv.org/abs/2006.07712)

- (H. Li, R. Armiento, and P. Lambrix)

- ◆ Fostering links and synergy with:

- European Materials Modelling Ontology (EMMO)

- Work that has already been done in the IUCr (International Union of Crystallography) about the CIF standard (CIF2)

- ◆ <https://github.com/Materials-Consortia/ontology>

- **Expanding to classical molecular dynamics and bio-simulations**

- Platform for fitting machine-learned interatomic potentials**

- ◆ Workshop in 30 May-3 June 2021 at CECAM + Digital

- <https://www.cecarn.org/workshop-details/1120>

- Contacts: gian-marco.rignanese@uclouvain.be

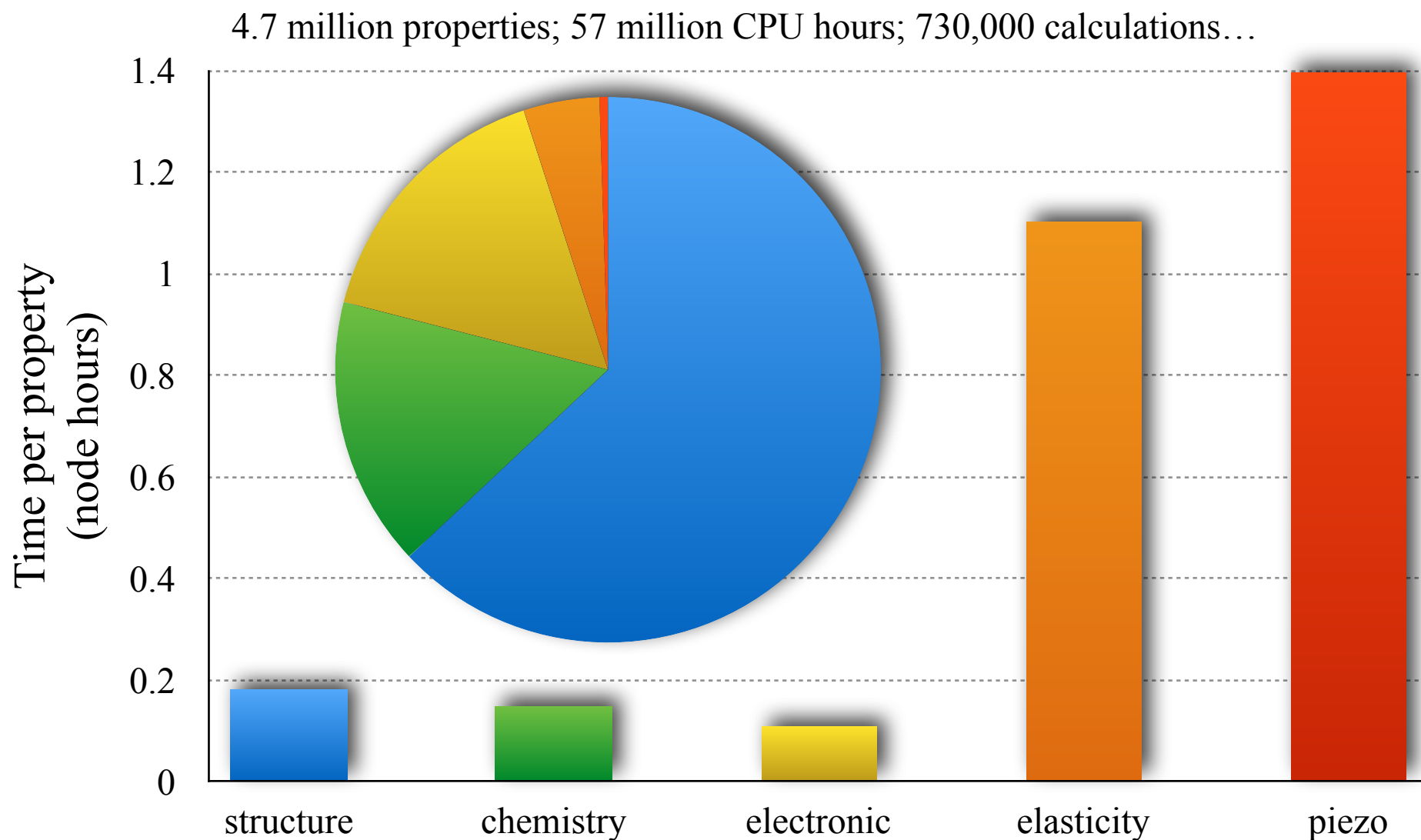


List of contributors (in alphabetical order)

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The amount of data available in the DBs

depends on the computing time for each property



For reducing the computational cost, machine learning may be very handy

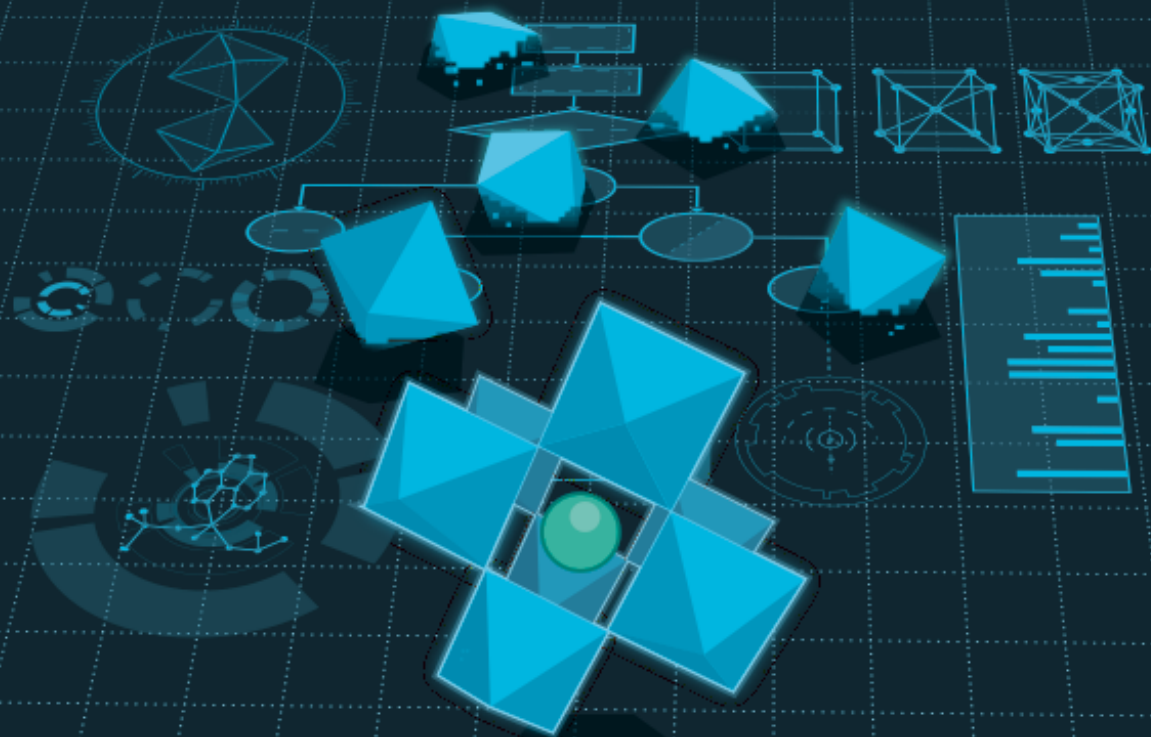
NEWS FEATURE

[N. Nosengo, Nature 566, 475 (2016)]

THE MATERIAL CODE

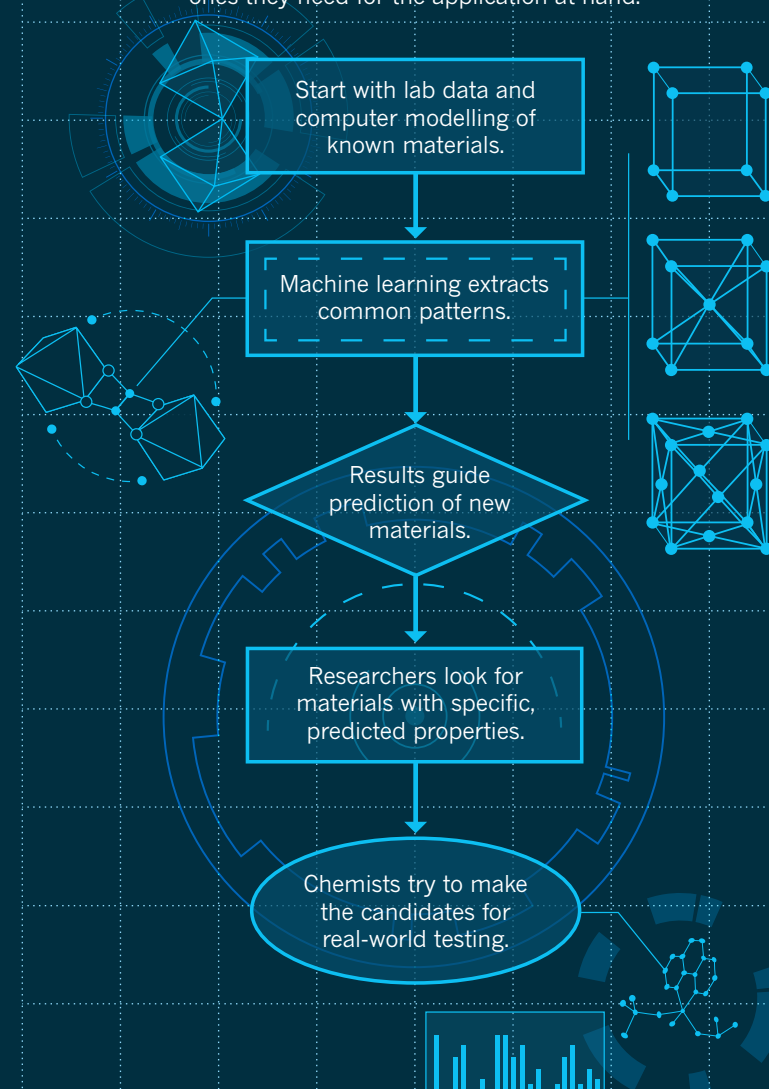
*Machine-learning techniques could revolutionize
how materials science is done.*

BY NICOLA NOSENGO



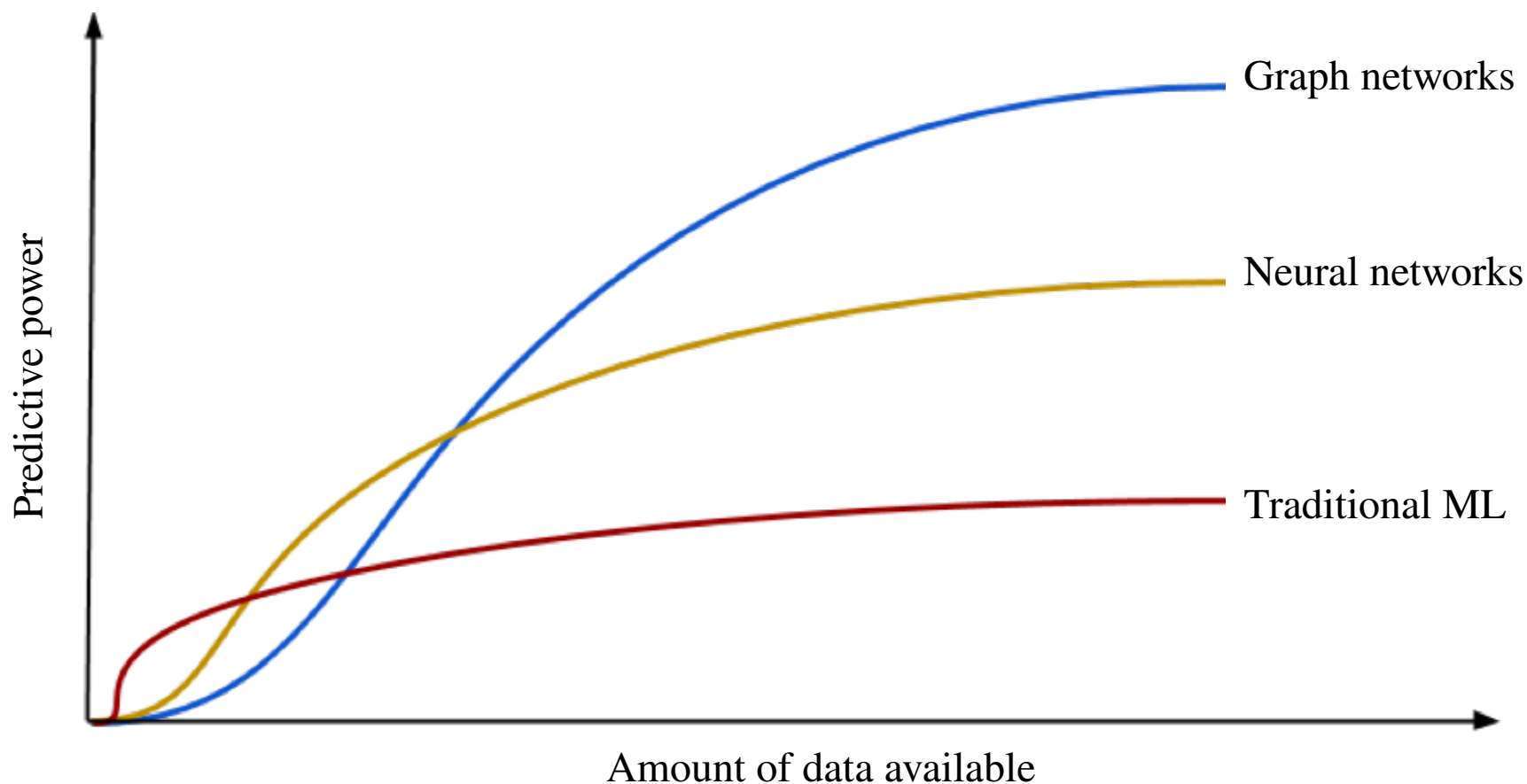
INTELLIGENT SEARCH

Artificial intelligence can help researchers to comb through vast numbers of materials to find just the ones they need for the application at hand.



The predictive power of the model

depends on the amount of data available



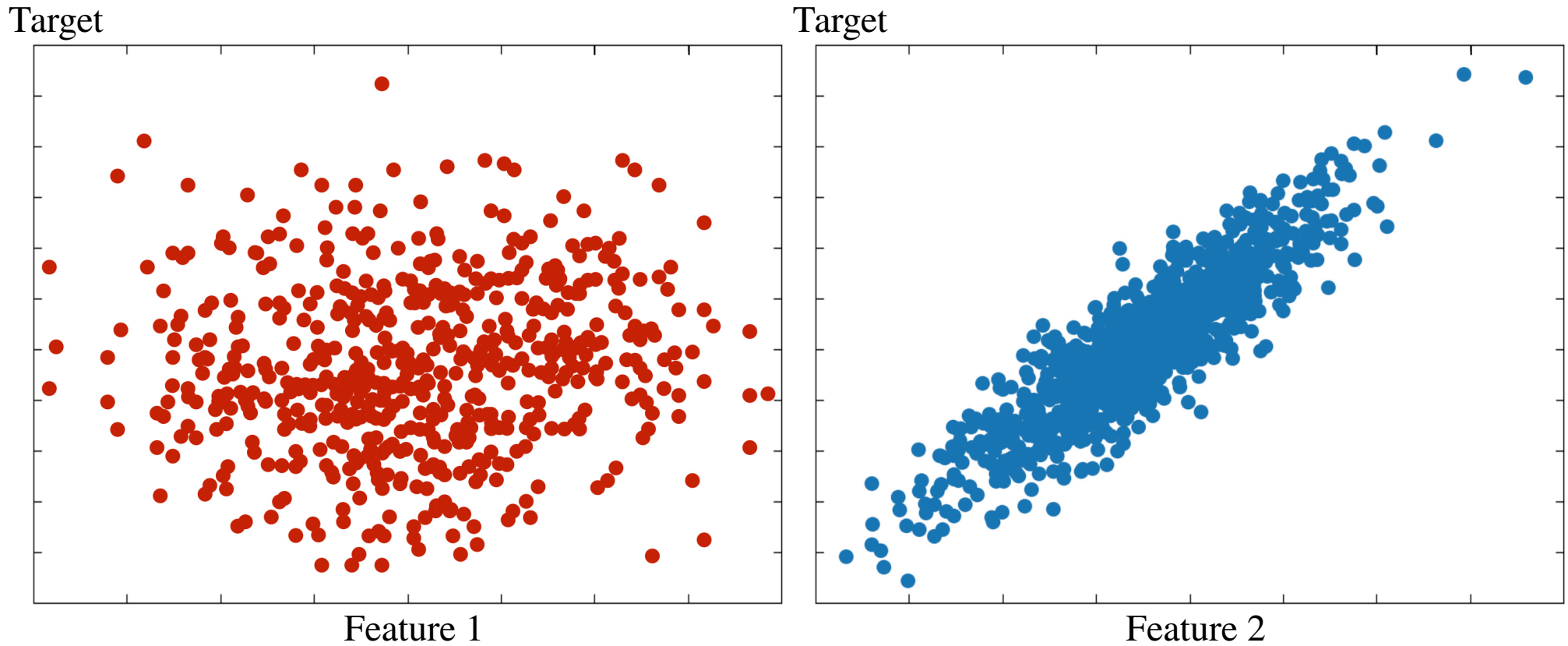
Computationally demanding material properties

are precisely those with little available data

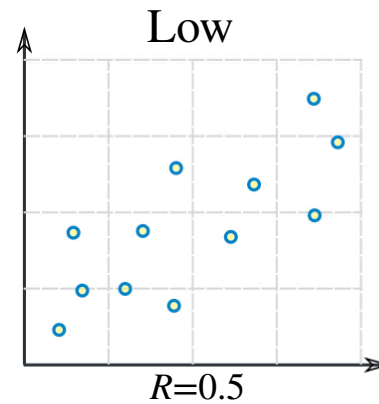
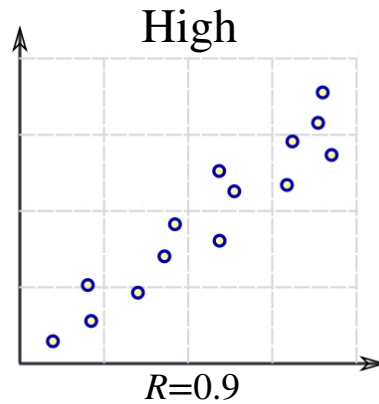
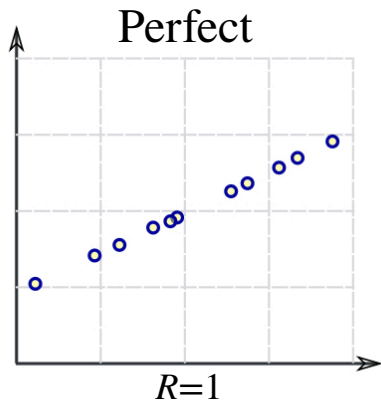
Material Optimal Descriptor Network (MODNet)

- Concept: feedforward neural network with an optimal set of descriptors.
- Idea: **Feature selection** by **relevance-redundancy algorithm**
 - ◆ Prior physical knowledge and constraints are taken into account by adopting physically-meaningful features.
 - ◆ This reduces the optimization space without relying on a massive amount of data.
- Bonus: **Novel architecture** that learns on **multiple properties**

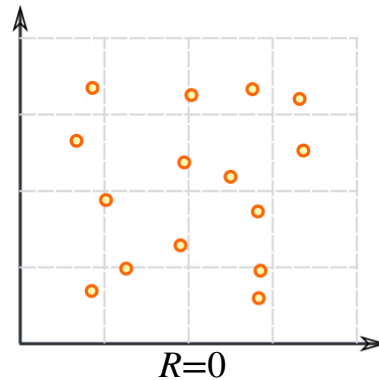
To be relevant, the selected features should present some kind of interrelation with the target property



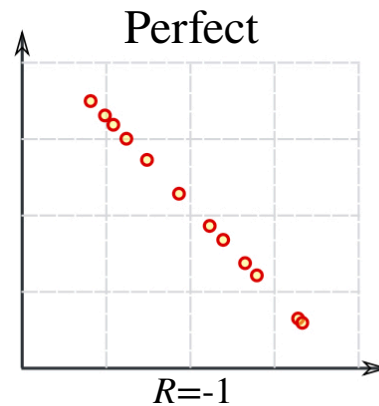
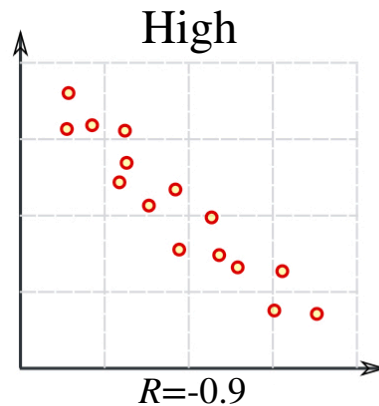
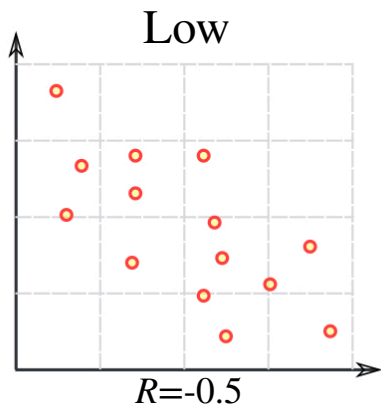
Pearson correlation coefficient is a measure of the interrelation between two variables



Positive correlation



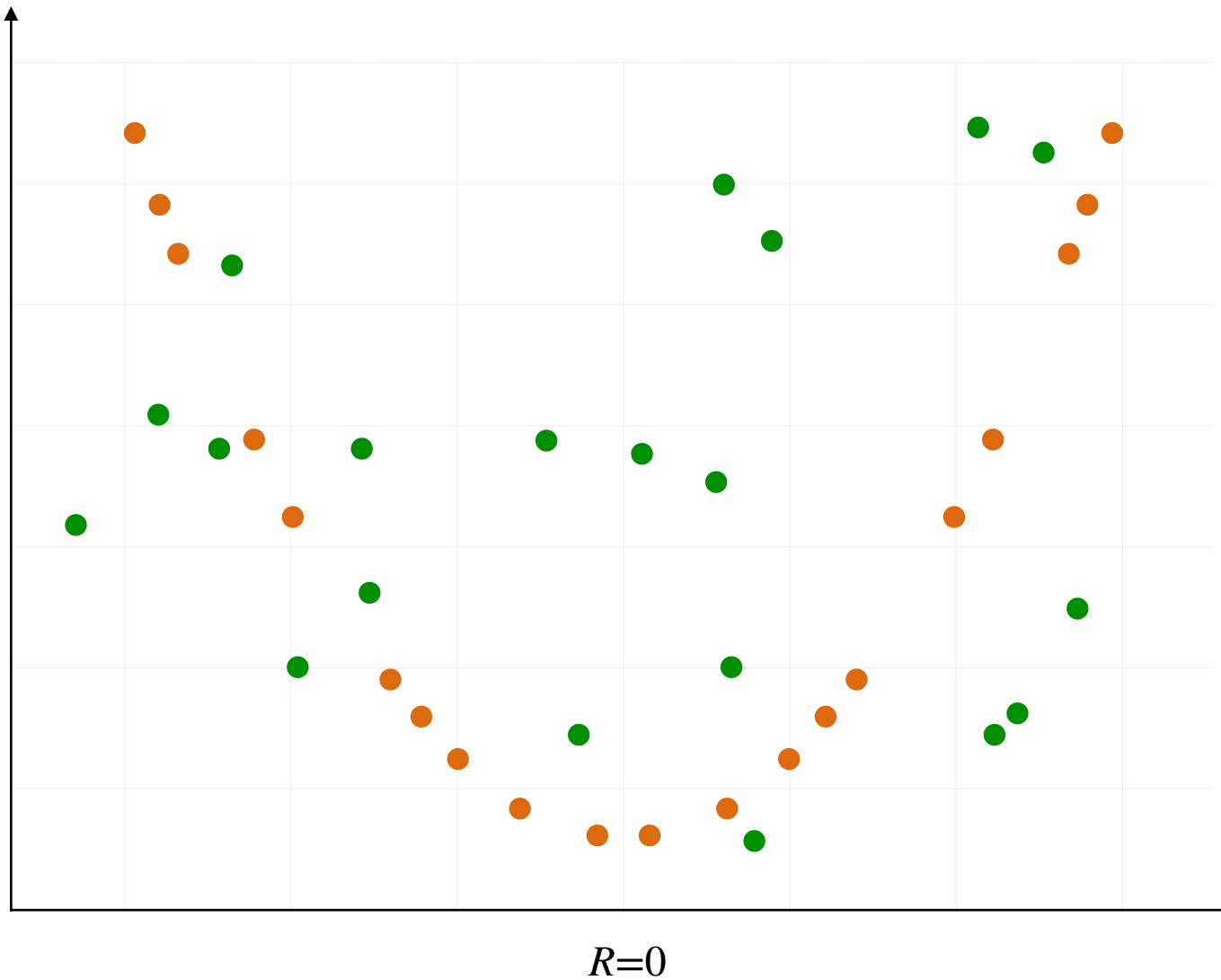
No correlation



Negative correlation

Pearson correlation coefficient

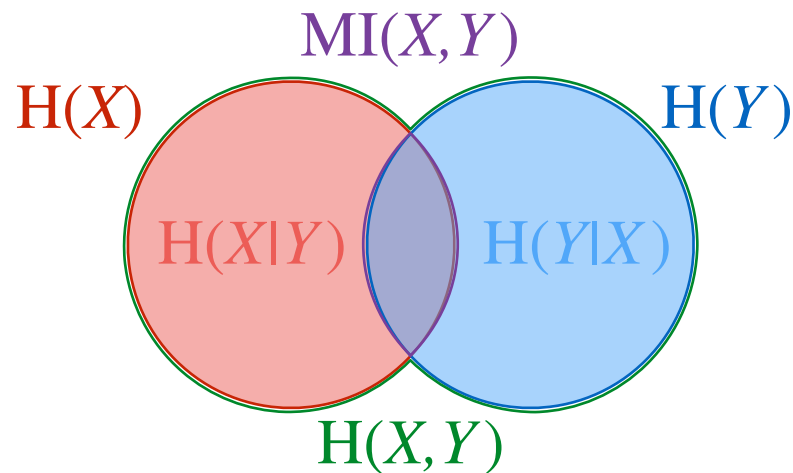
presents, however, a series of limitations



In MODNet, feature selection is based on the Normalized Mutual Information (NMI)

- The **mutual information** (MI) of two random variables is a measure of the mutual dependence between the two variables.

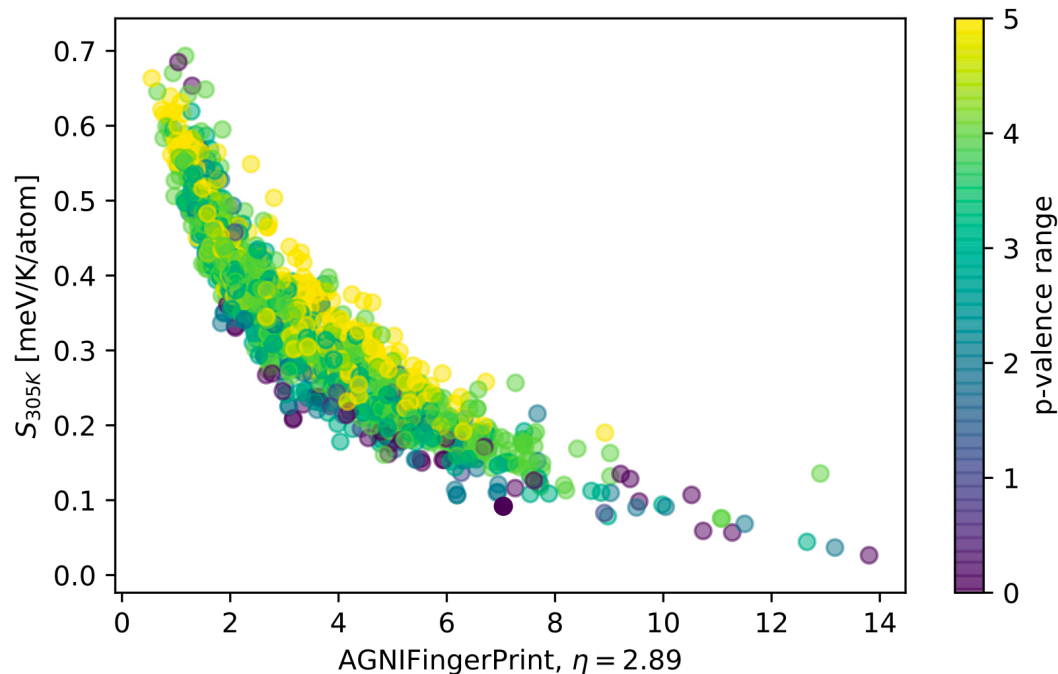
It quantifies the "amount of information" (entropy) obtained about one random variable through observing the other random variable.



- Their Normalized Mutual Information $NMI(X, Y) = \frac{MI(X, Y)}{(H(X) + H(Y))/2}$ is bounded between 0 (○ ○) and 1 (● ●)

The feature f having the highest NMI with the target variable y will be chosen the first one

- This provides some understanding of the underlying physics. Indeed, it pinpoints the most important and complementary variables.
- For instance, the vibrational entropy is found to be strongly related to
 - ◆ the inter-atomic bond length
 - ◆ the valence range of the constituent elements (ionicity of the bond).



For the next chosen features,

redundancy should also be avoided

- To this end, we define a relevance and redundancy RR score: given

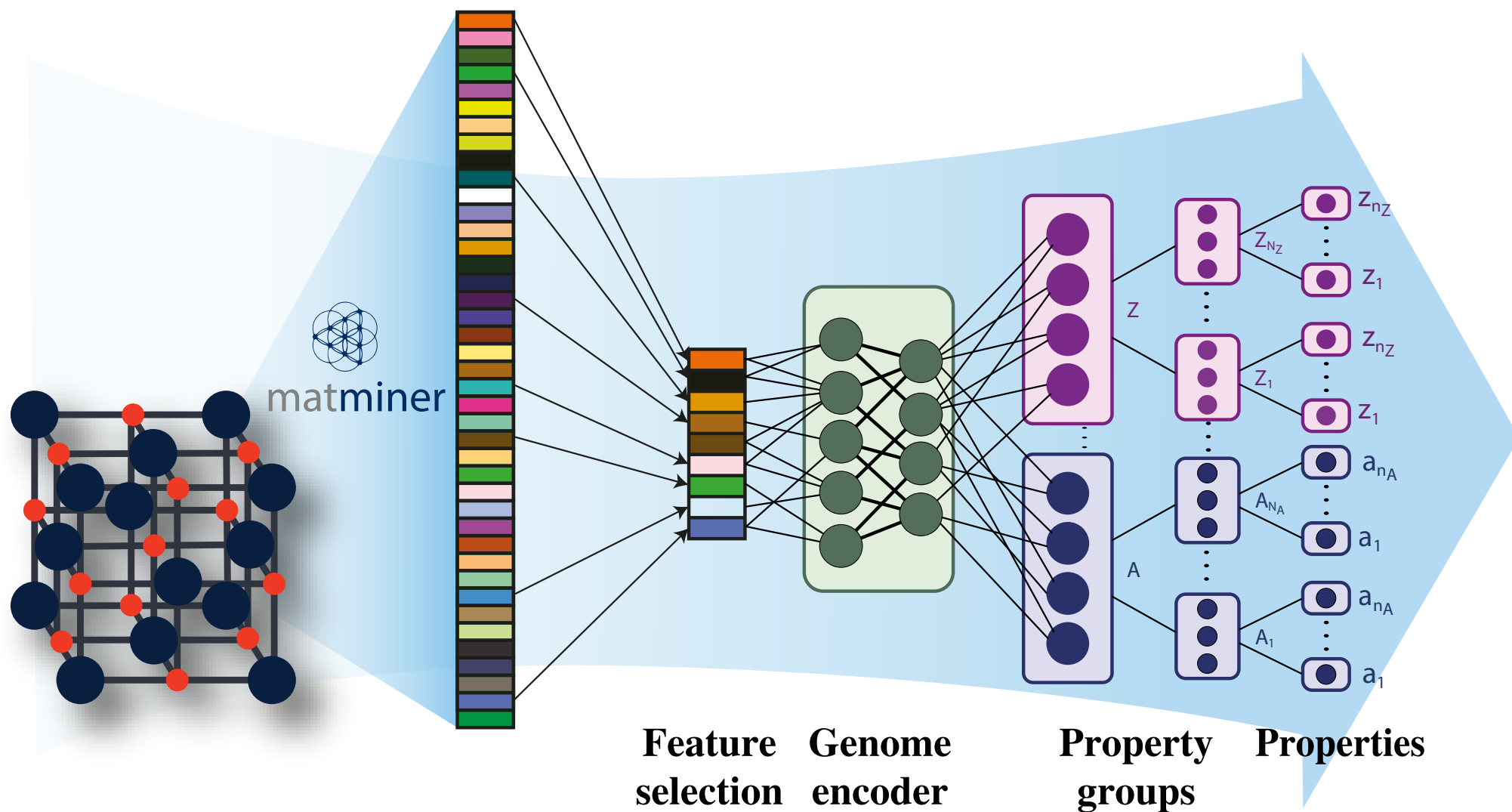
- ◆ a subset of selected features \mathcal{F}_s extracted from the set \mathcal{F}
- ◆ another feature f

$$RR(f) = \frac{\text{NMI}(f, y)}{\left[\max_{f_s \in \mathcal{F}_s} (\text{NMI}(f, f_s)) \right]^p + c}$$

where p and c are determine the relevance/redundancy balance.

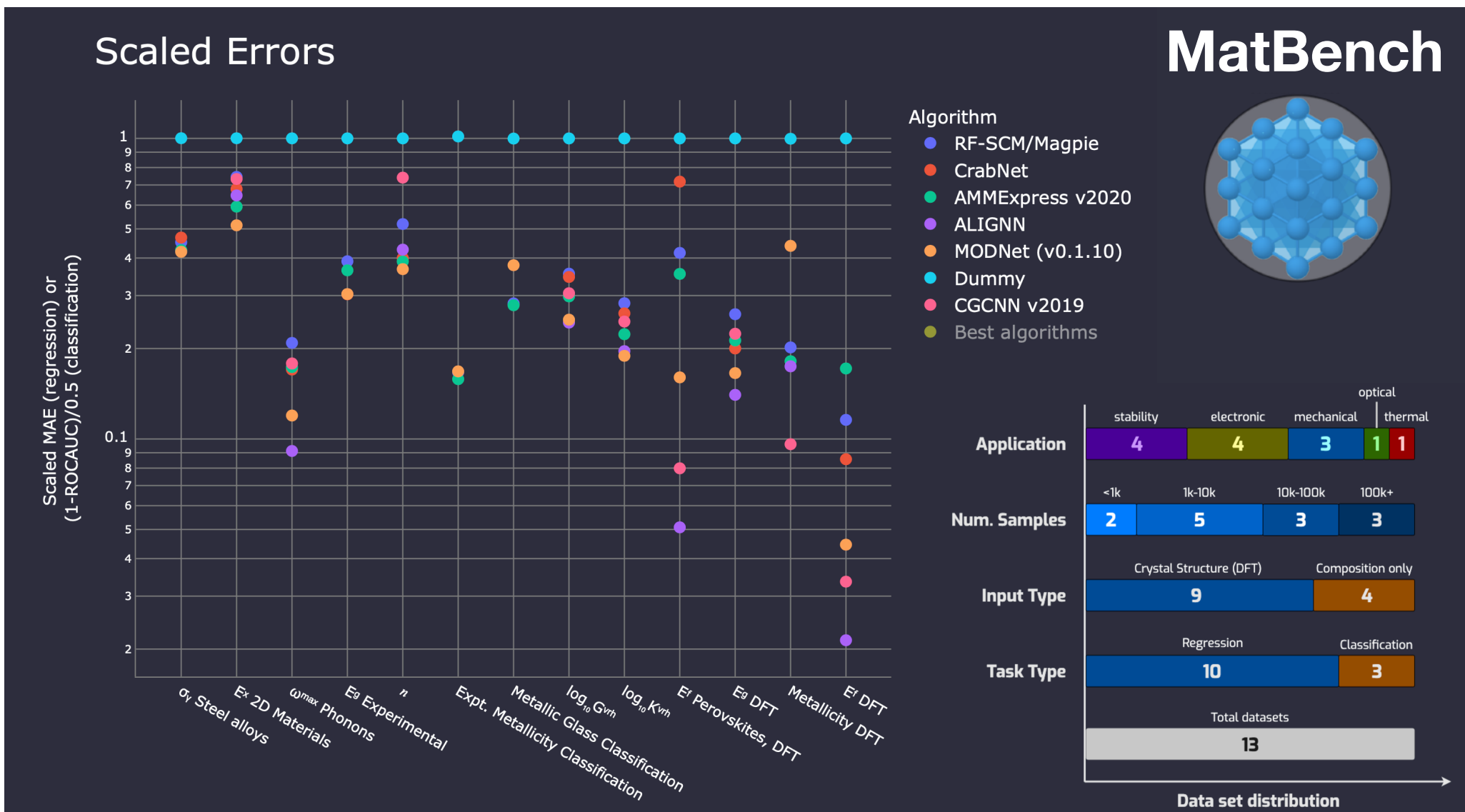
- In practice, varying p and c dynamically seems to work better, as redundancy is a bigger issue with a small amount of features.
- The selection proceeds until the number of features reaches a threshold (fixed arbitrarily or, better, optimized to minimize the model error).

MODNet introduces the possibility of learning on multiple properties simultaneously



MODNet performs very well

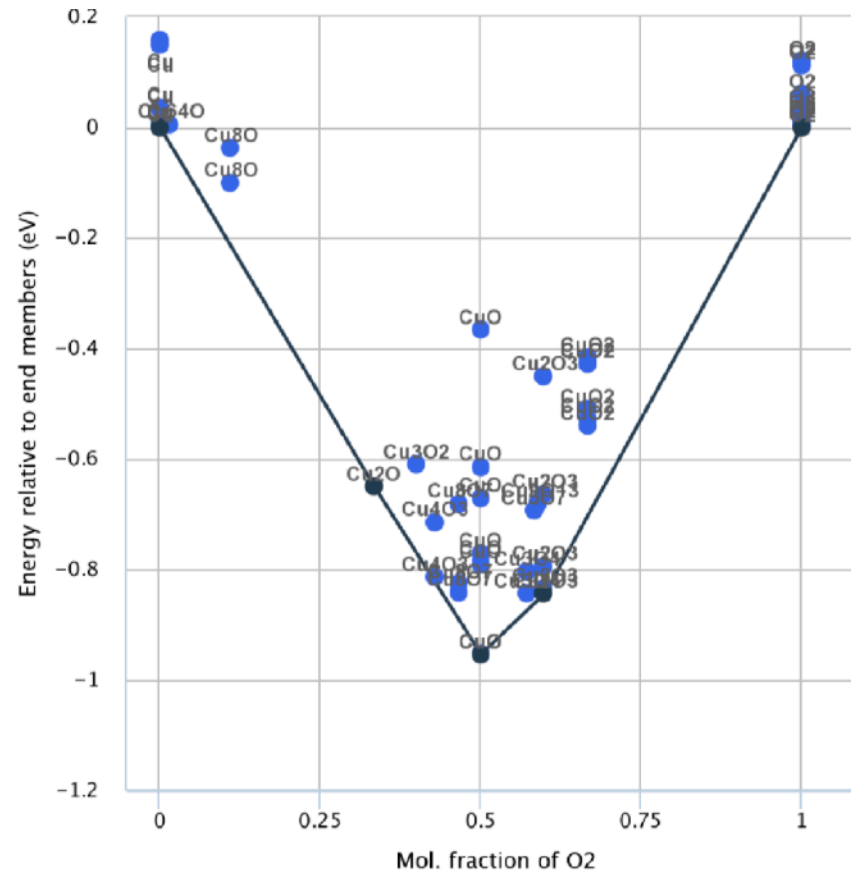
on the curated MatBench test suite



[A. Dunn *et al.*, npj Comput. Mater **6**, 138 (2020); <https://github.com/hackingmaterials/matbench>]

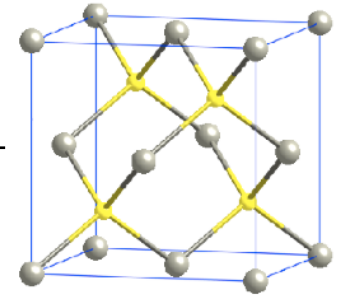
How can we predict the phase stability of polymorphs at different temperatures?

- At $T=0\text{K}$: for example, the Cu-O system



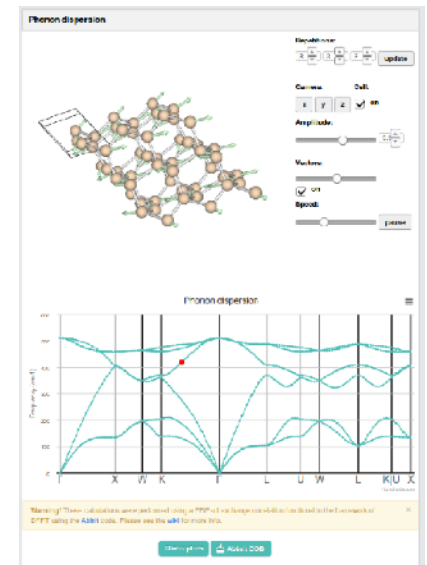
- At $T>0\text{K}$, the vibrational entropy needs to be taken into account. This can be done by DFPT but it is very demanding.

An automatic workflow was developed



Autoparal

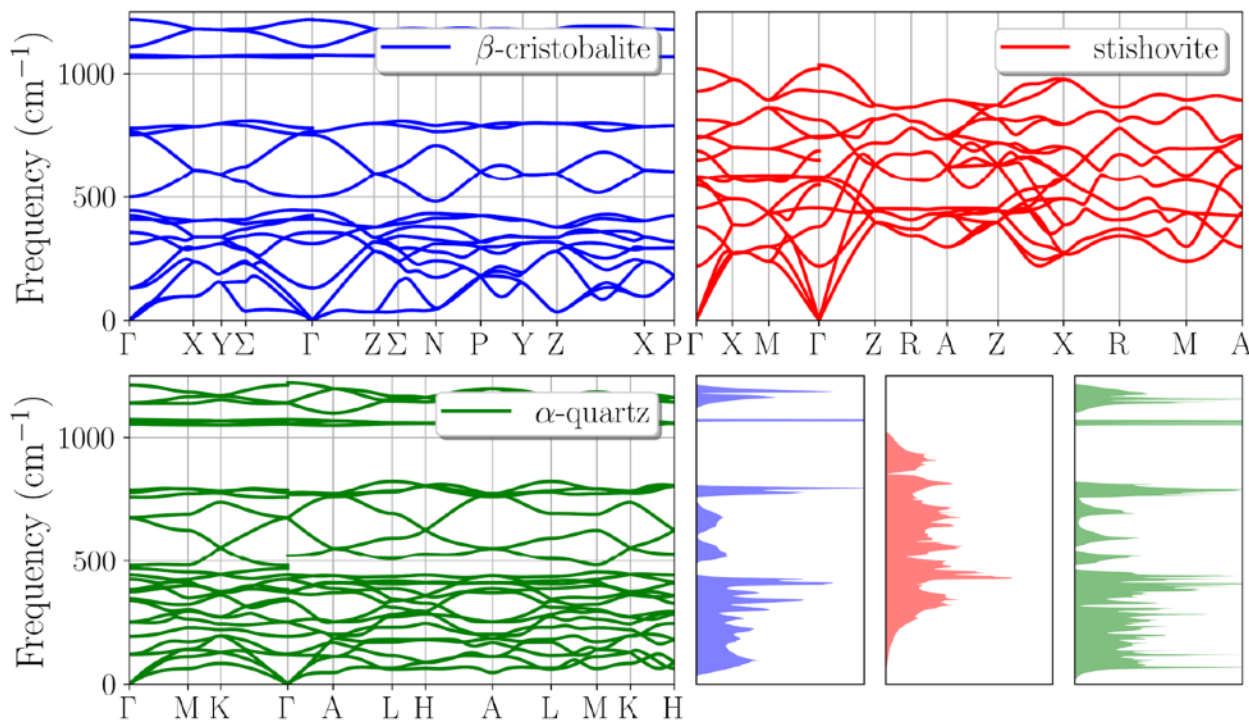
- Automatic parallel configuration
- Automatic error handling
- Perturbations fully parallelized
- Store the results on a Database



The vibrational properties

were calculated for 1521 semiconductors

- The dataset includes:
 - ◆ phonon band structure
 - ◆ LO-TO splitting
 - ◆ phonon DOS
 - ◆ Born effective charges
 - ◆ dielectric tensor
 - ◆ derived quantities:
 ΔF , ΔE_{ph} , C_v and S

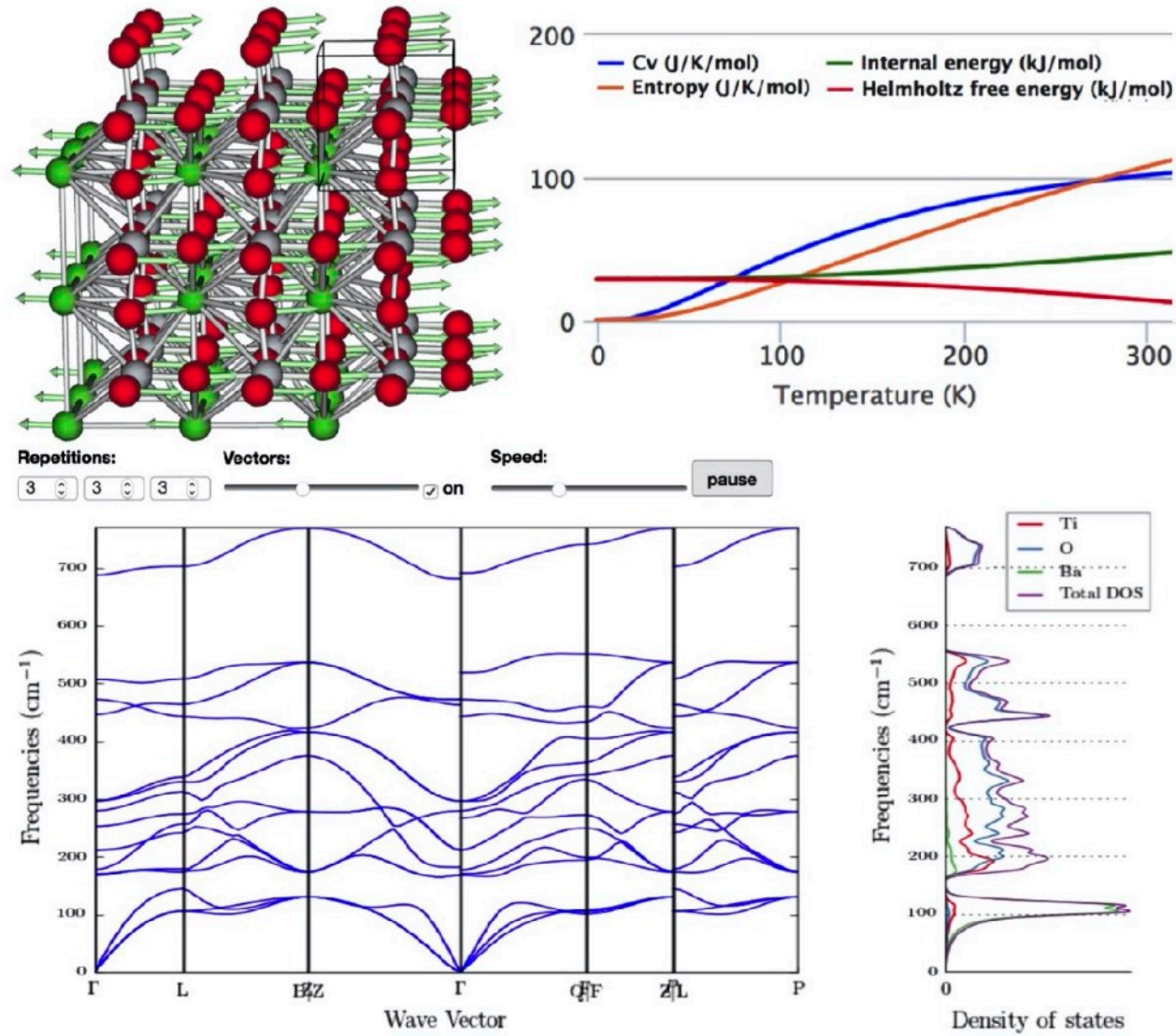


- The dataset is openly available!



G. Petretto, S. Dwaraknath, H.P.C. Miranda, D. Winston, M. Giantomassi, M.J. van Setten, X. Gonze, K.A. Persson, G. Hautier, and G.-M. Rignanese, *Sci. Data* **5**, 180065 (2018).

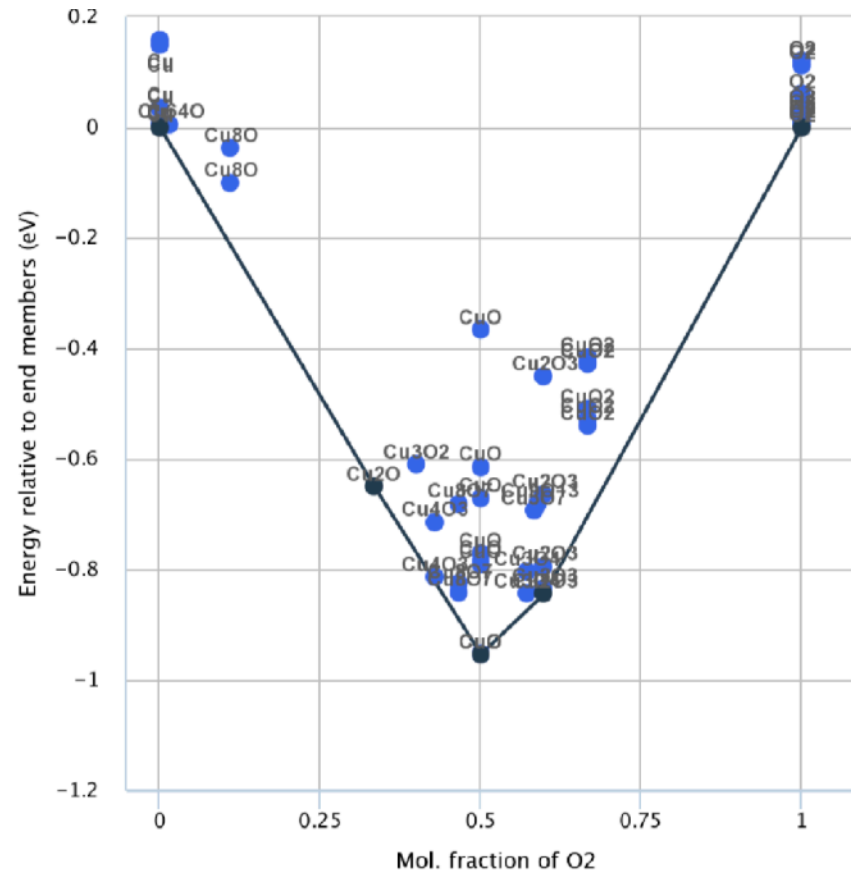
The vibrational properties are available on the Materials Project website



... but only for those 1521 semiconductors

How can we predict the phase stability of polymorphs at different temperatures?

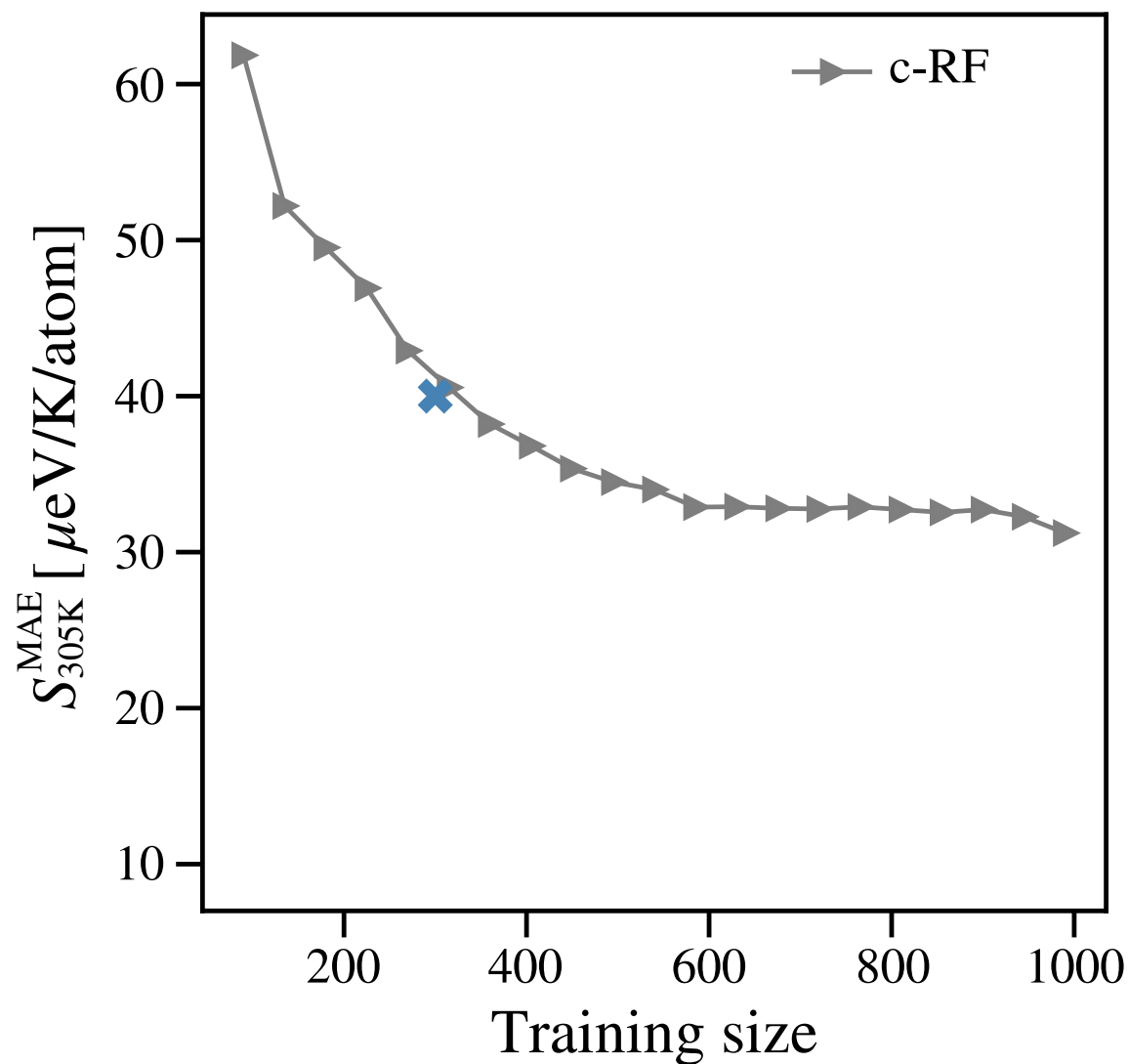
- At $T=0\text{K}$: for example, the Cu-O system



- At $T>0\text{K}$, the vibrational entropy needs to be taken into account.
Let's use machine learning.

Early attempts with ML were based on

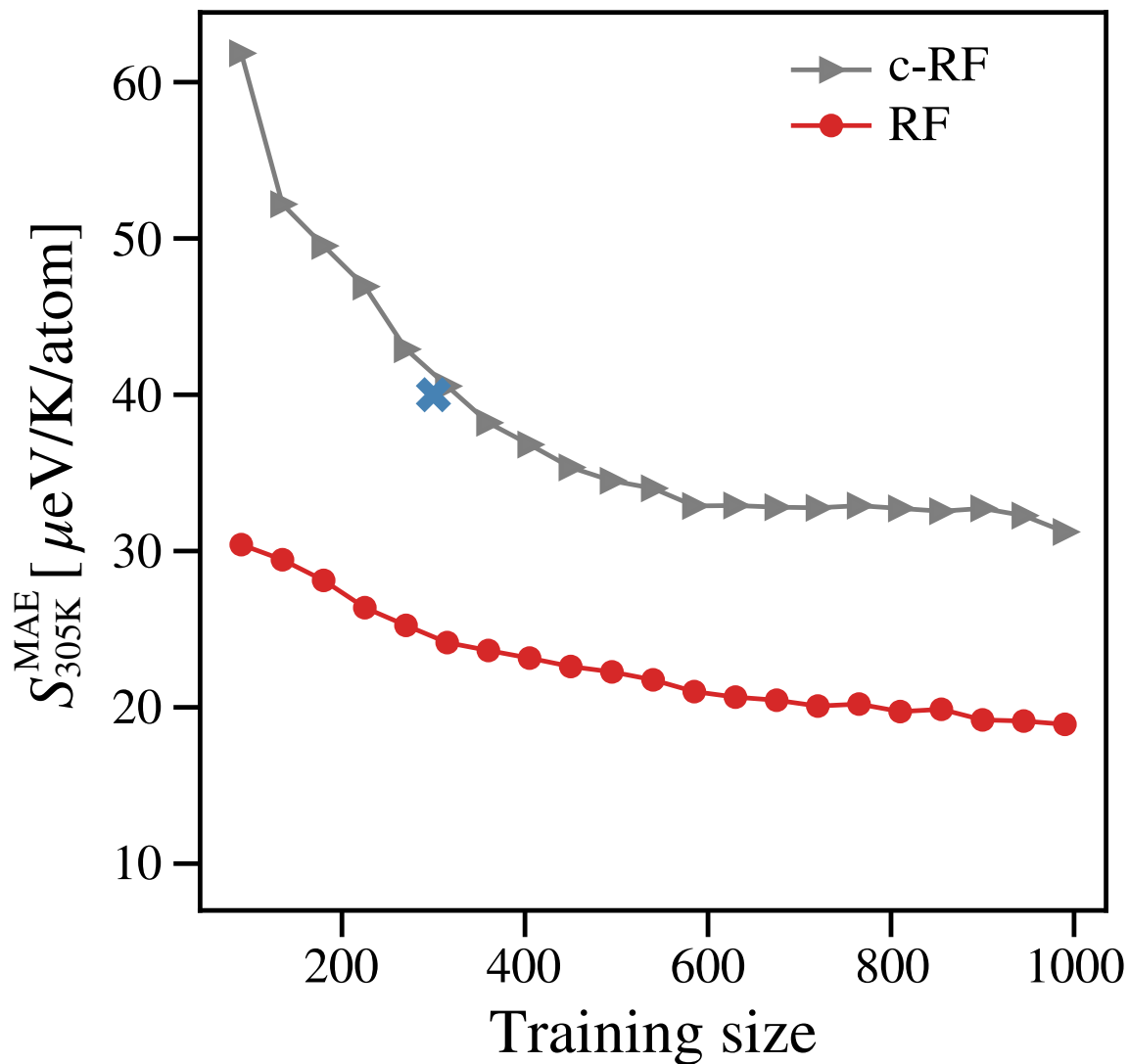
RF using only chemical composition features



[F. Legrain *et al.*, Chem. Mater. **29**, 6220 (2017)]

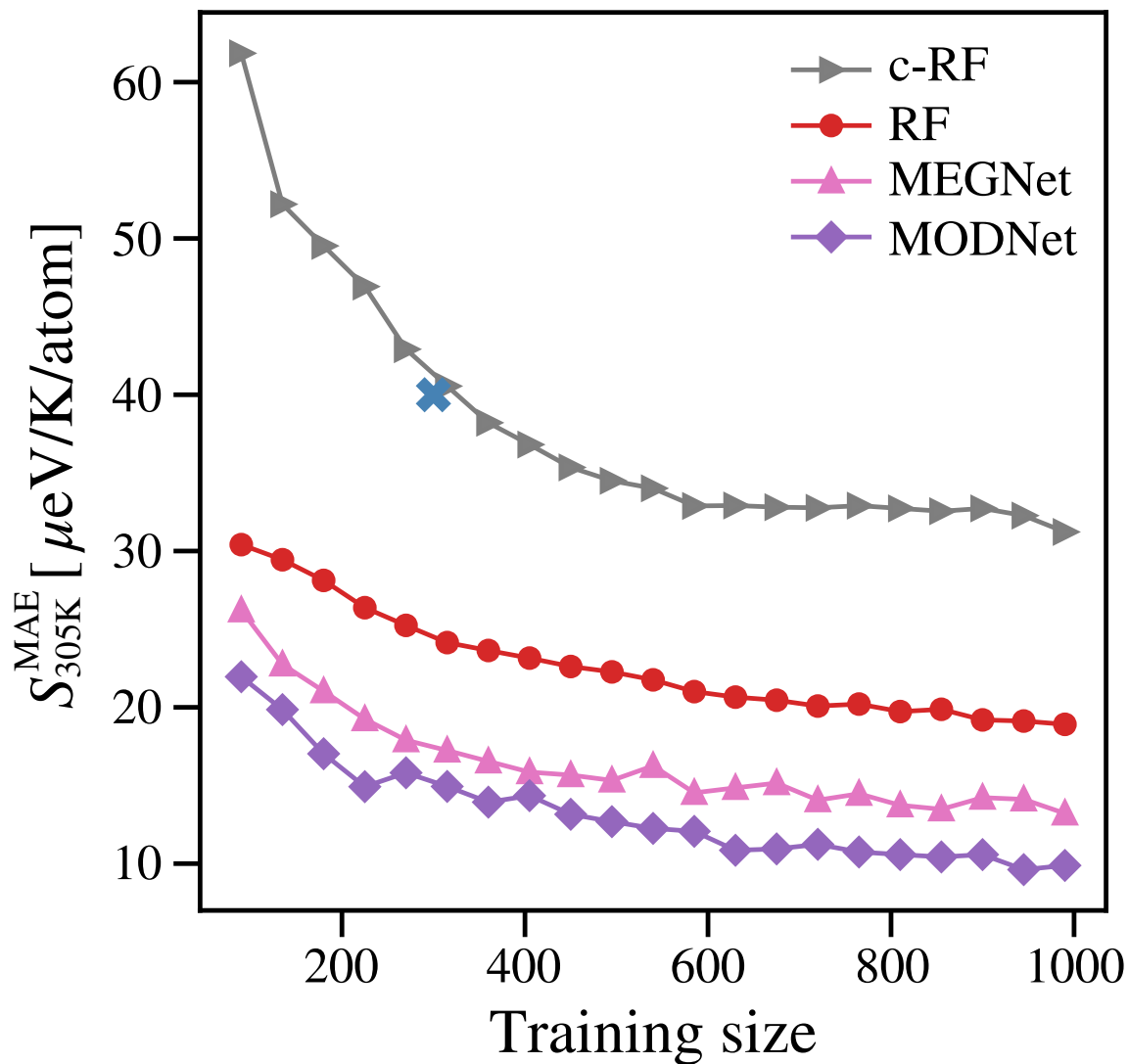
Including structural features

clearly improves the predicting power



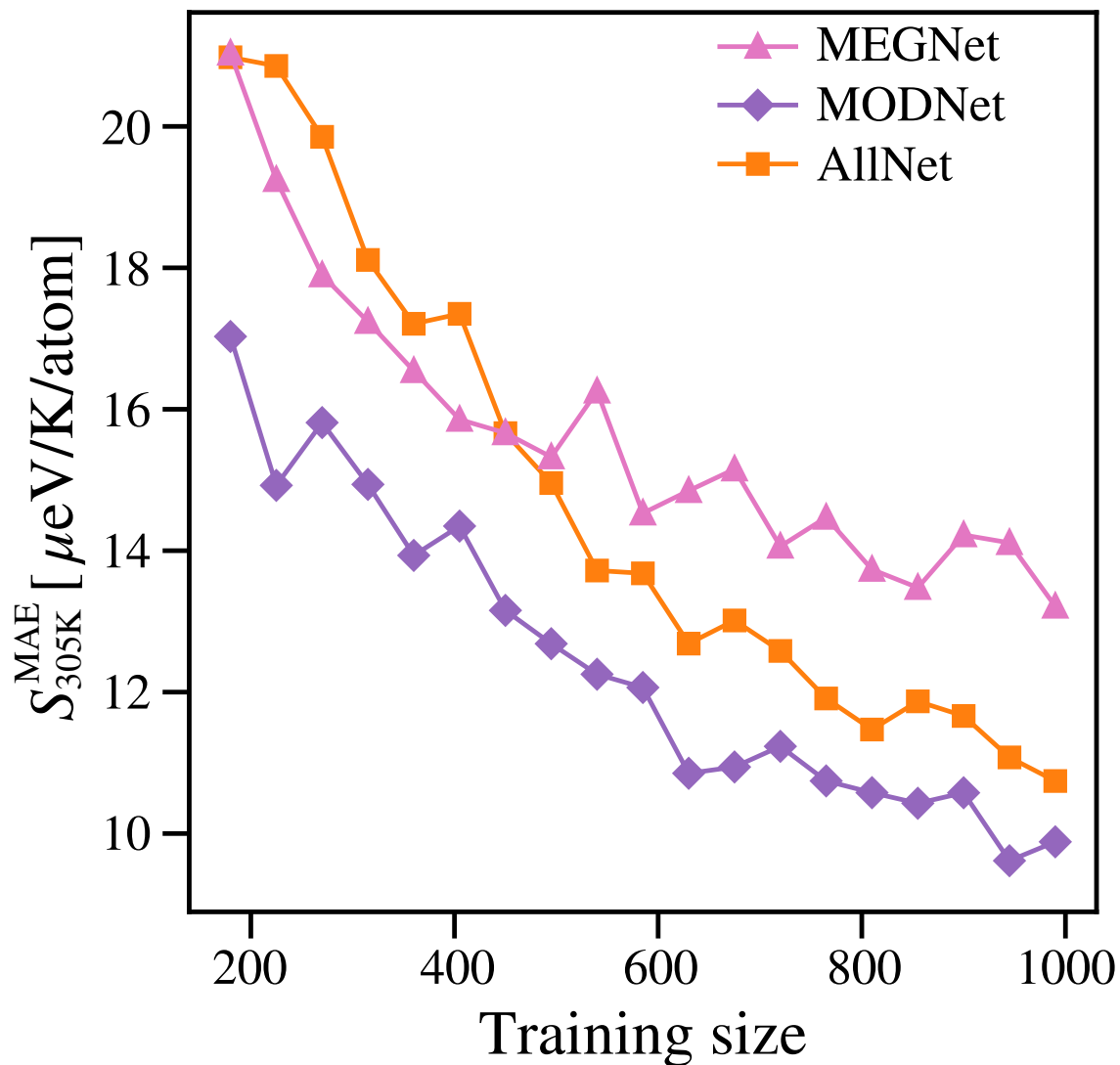
NB: Performing feature selection on the input space has no effect on the results as a RF intrinsically selects optimal features while learning.

Neural-network models perform better than RF approaches whatever the size of the data set



[P.-P. De Breuck *et al.*, npj Computational Materials 7, 83(2021)]

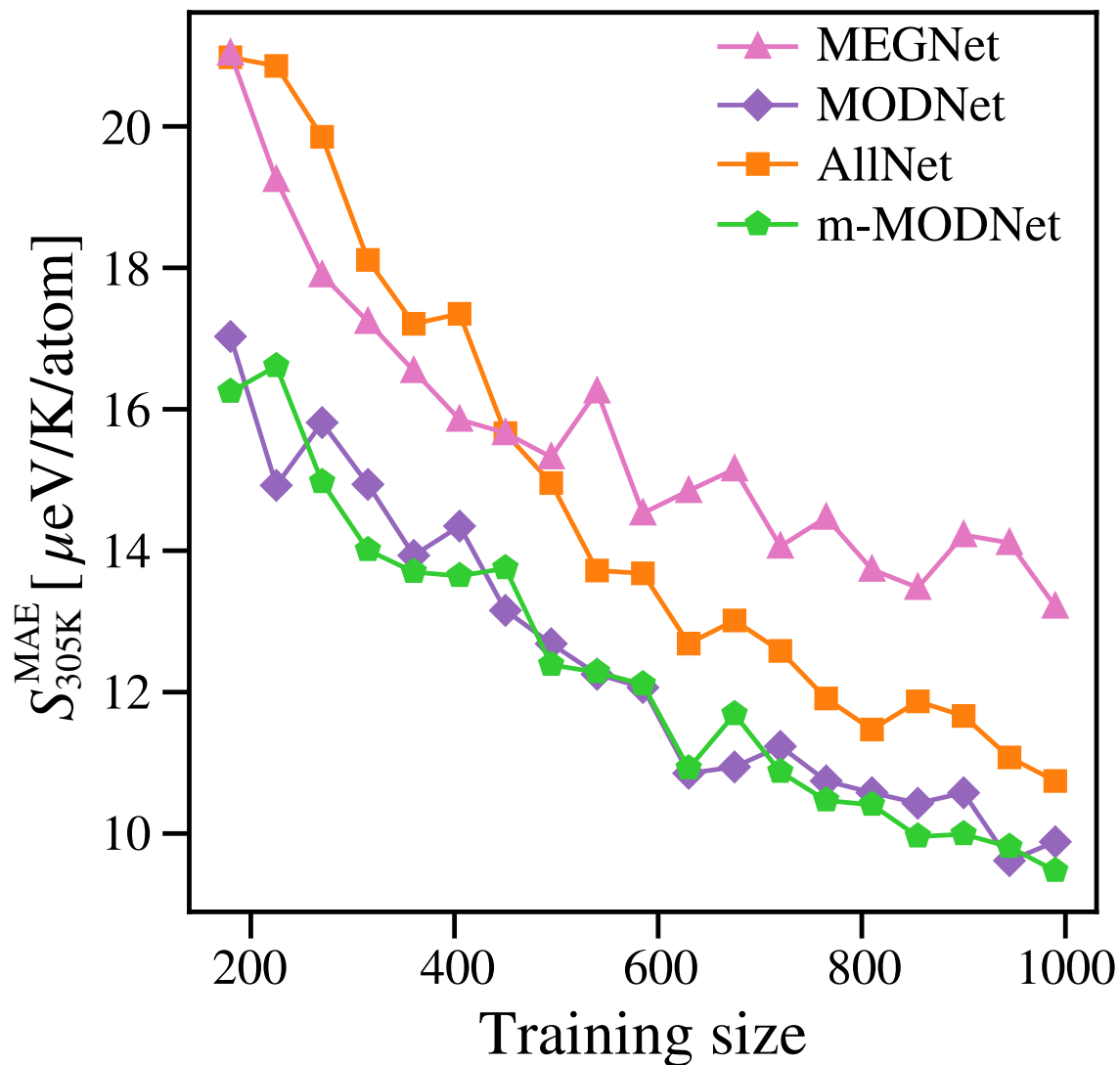
Feature selection is really important especially for small training size



[P.-P. De Breuck *et al.*, npj Computational Materials 7, 83(2021)]

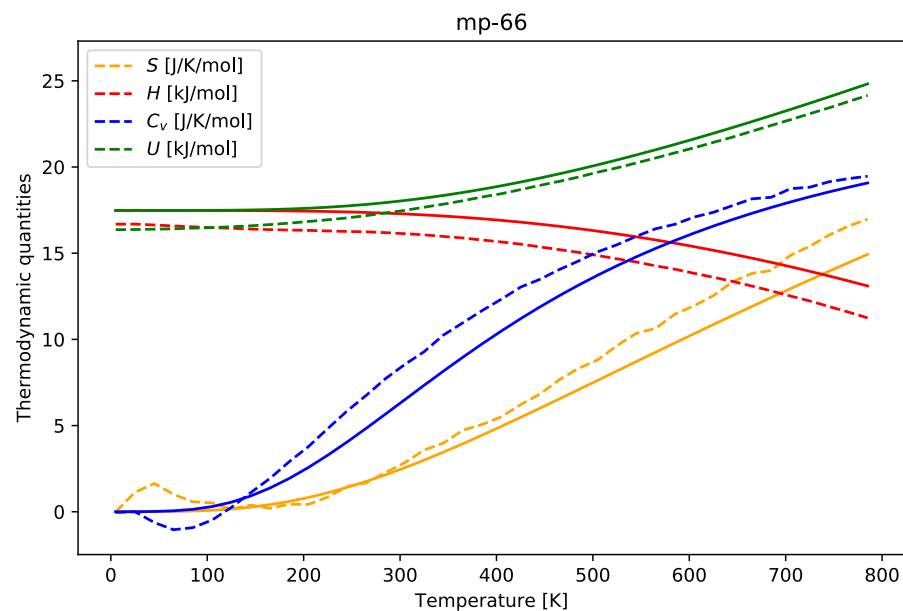
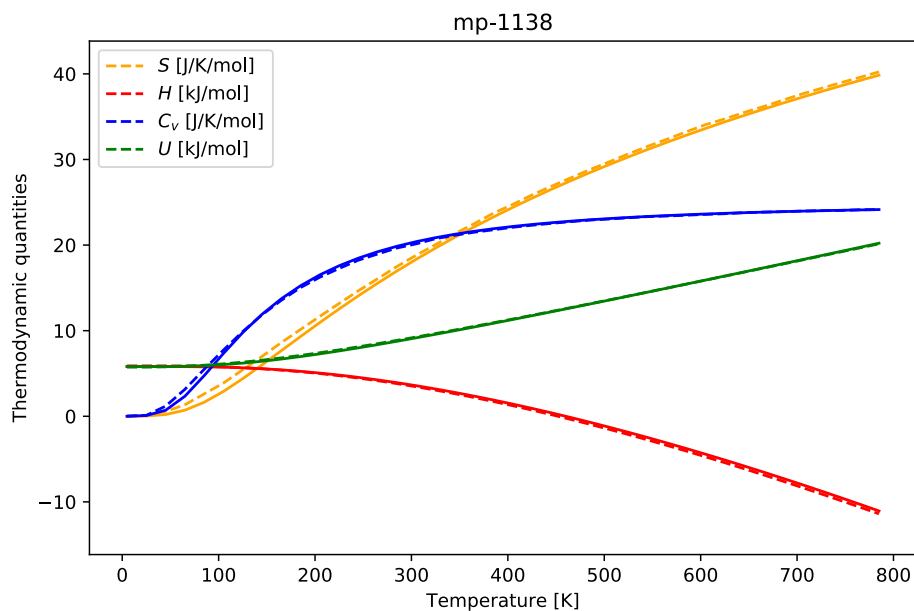
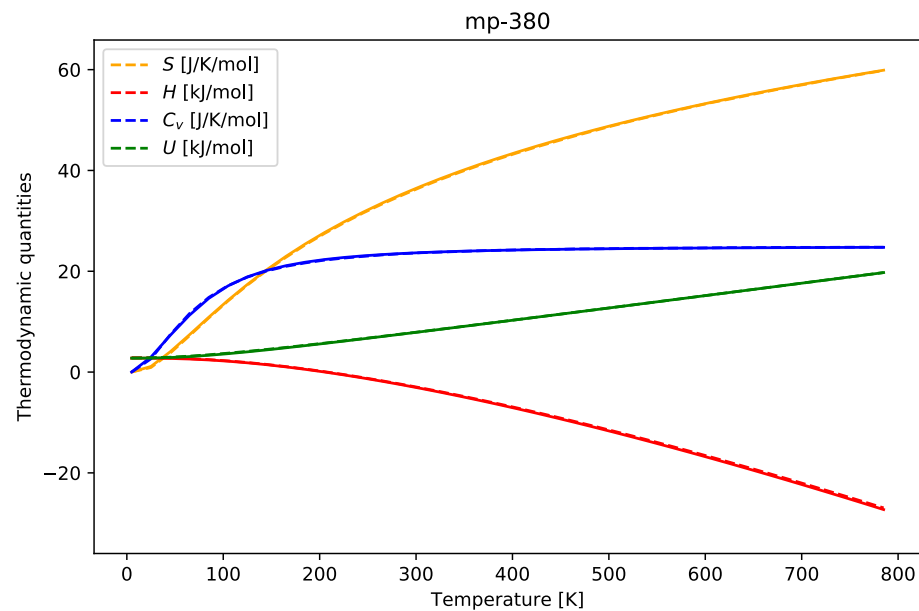
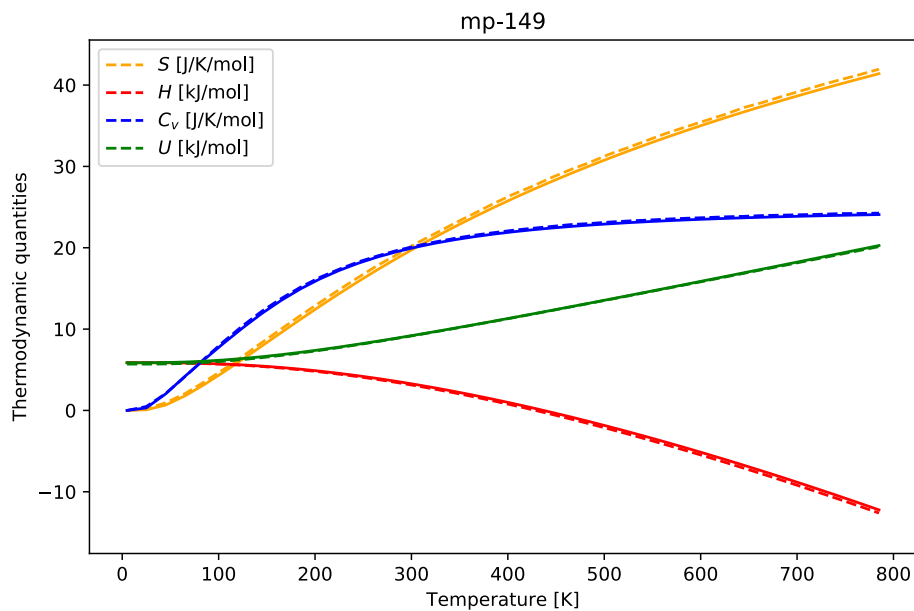
The joint-learning approach (m-MODNet)

shows on average a slight improve in accuracy



and provides a single model for multiple properties

In particular, it is possible to obtain curves of the thermodynamic properties vs. temperature



Thanks to this approach, we can build temperature dependent stability graphs

