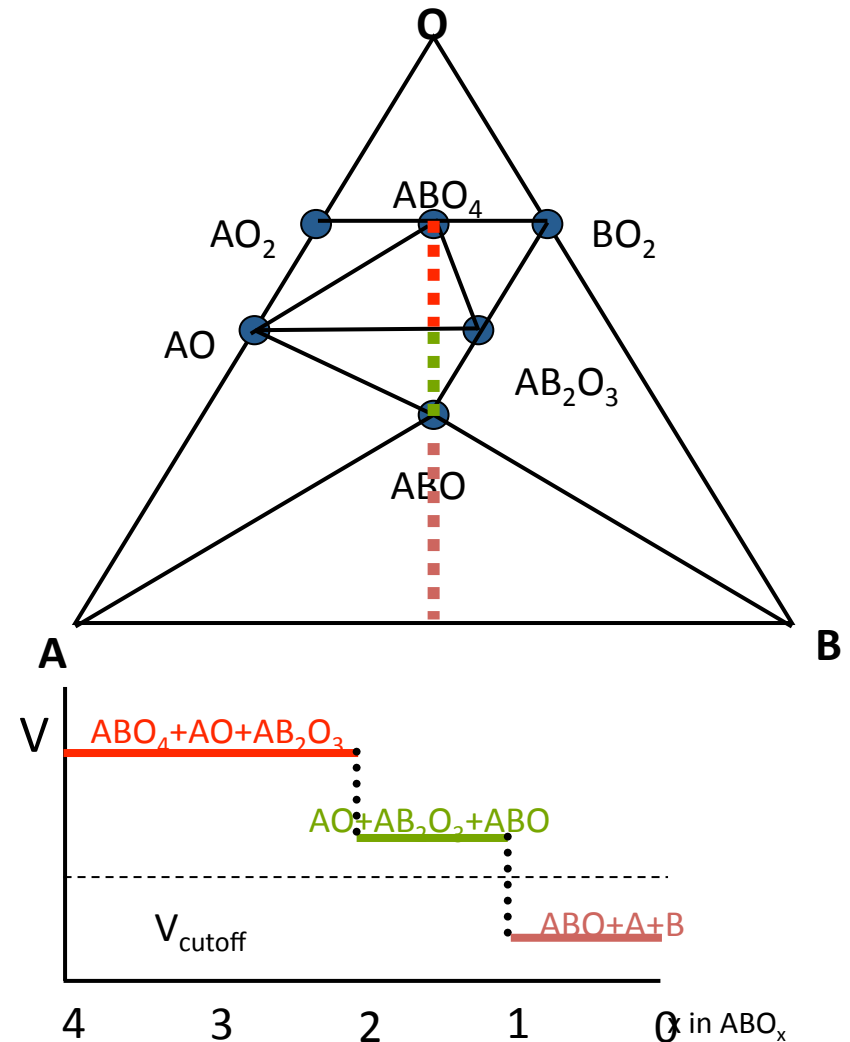
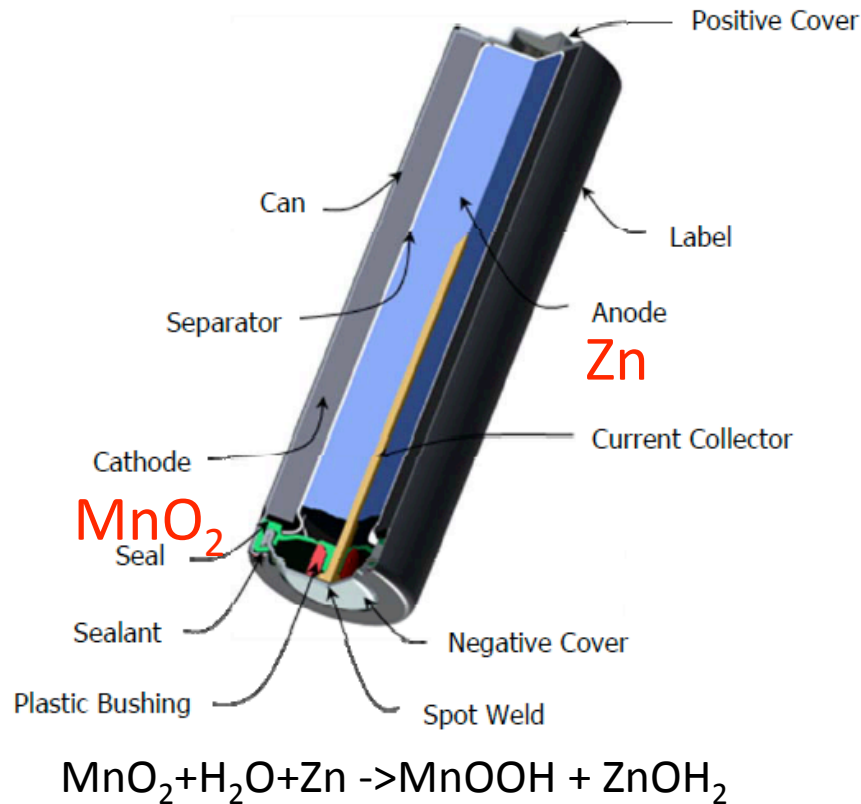


Ok – Assume we fixed the computing –  
Does it work?

High-throughput Materials Design:  
Alkaline batteries

# Finding higher energy density cathode

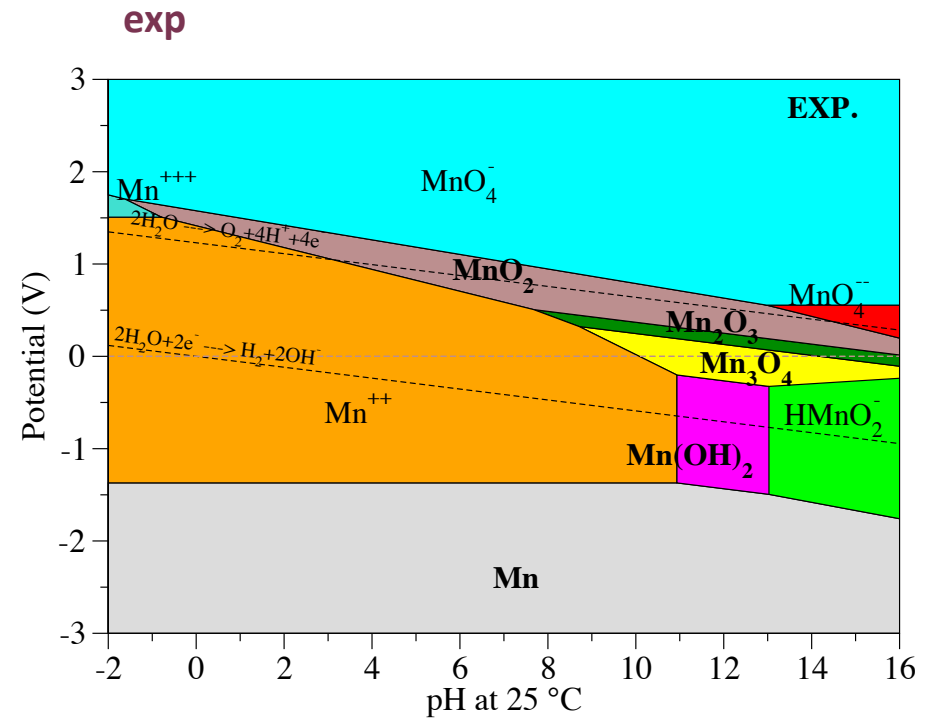
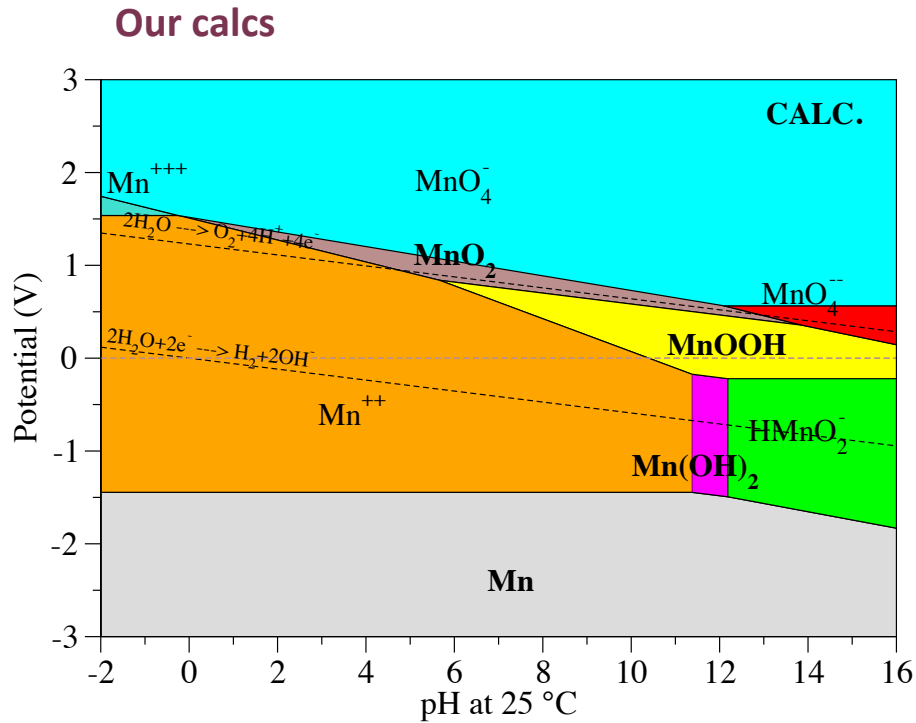


## SPECS:

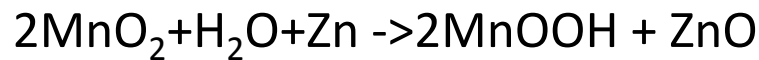
Higher energy density

Both reactants and products stable in high molar KOH

# Needs to model reactions at pH = 15

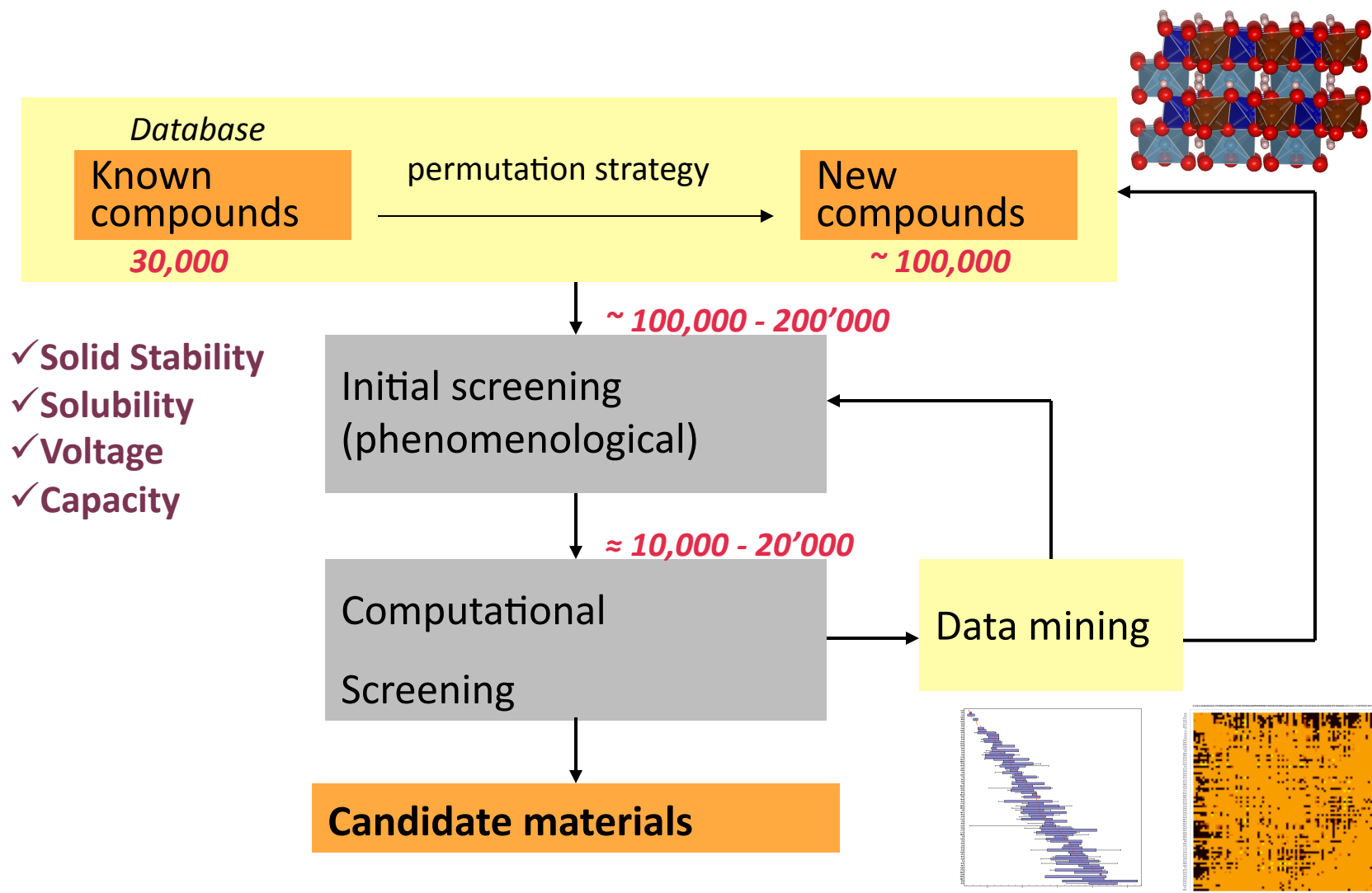


## Alkaline cell reaction

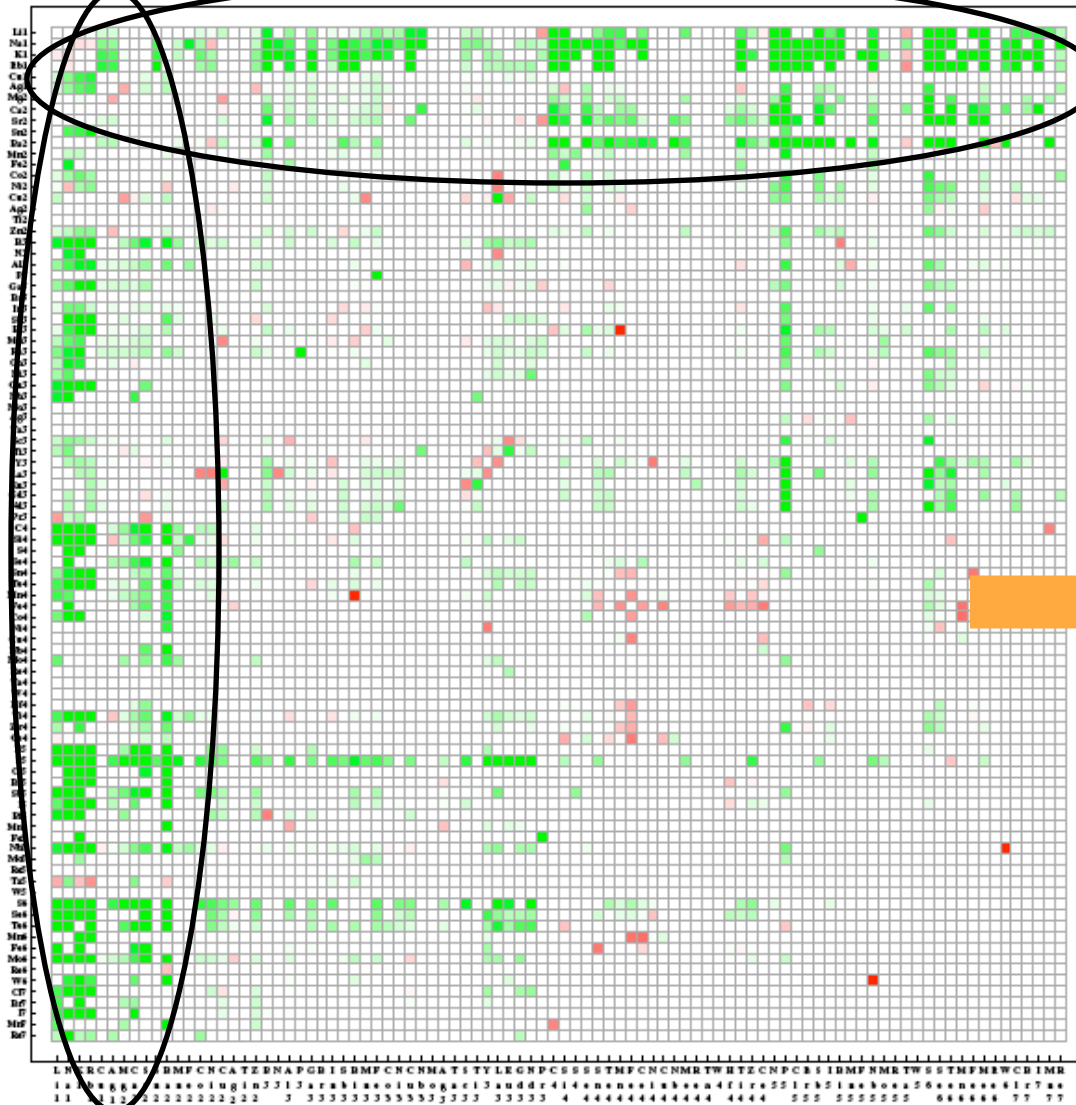


M. Pourbaix, "Atlas of Electrochemical Equilibria in Aqueous Solution", Pergamon Press, Paris (1966).

# The Screening Strategy



# Materials Design: Solid Stability Patterns

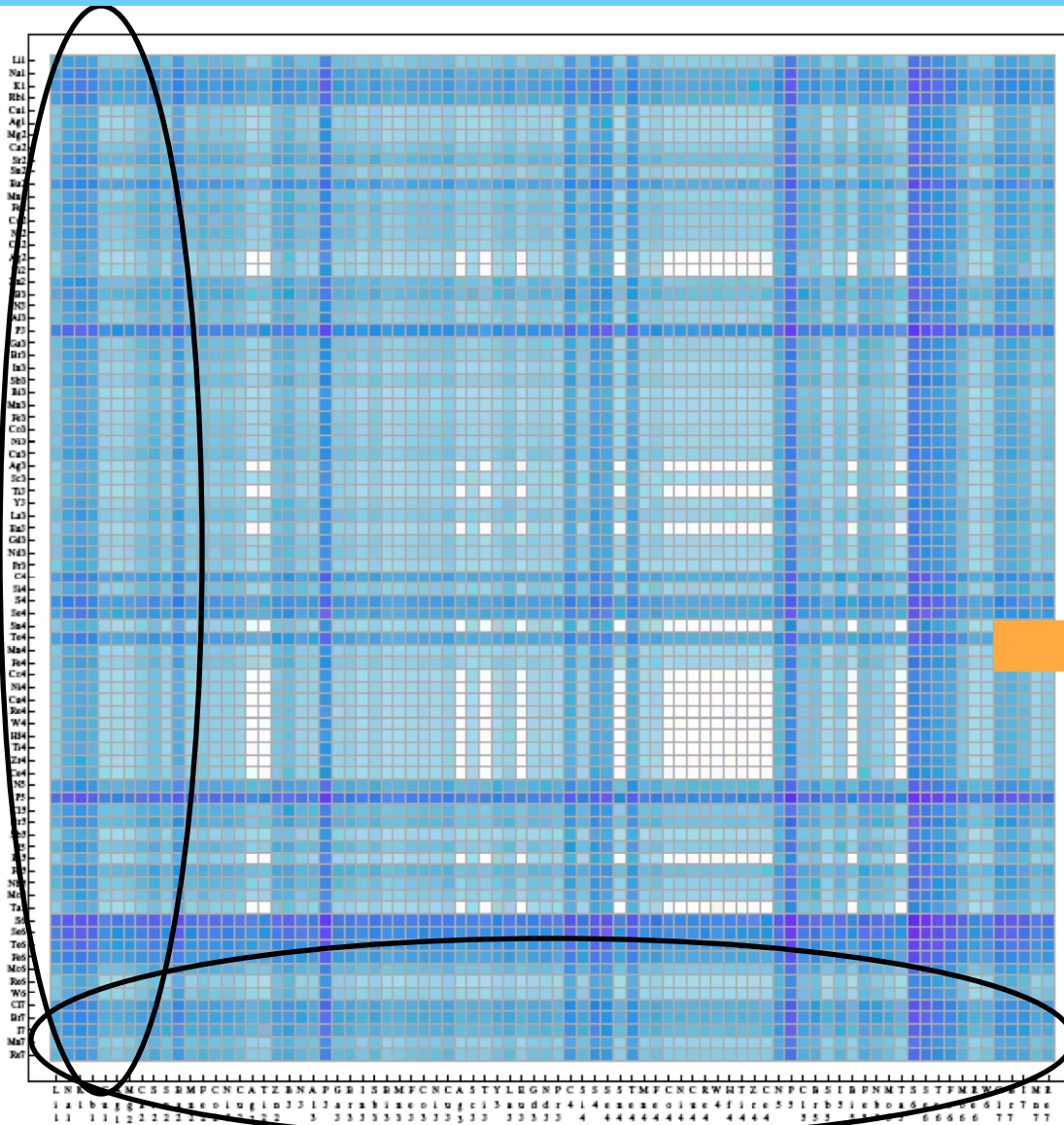


- High negative formation energy
- Negative formation energy
- Positive formation energy
- High positive formation energy

Which cation stabilizes another cation

Design stable solids

# Materials Design: KOH Instability



- High dissolution energy
- Moderate dissolution energy
- No dissolution energy

Which cations dissolve

Design stable solids at high pH

# Candidate Compounds and Design Rules

> 130,000 compounds considered

- 30,000 known from ICSD
- > 100,000 new generated

Tier 1



> 1500 compounds

- ✓ Capacity > 1 Ah/cc
- ✓ 1.1 V < Ave voltage < 2.2 V
- ✓ Energy density > 1.7Wh/cc

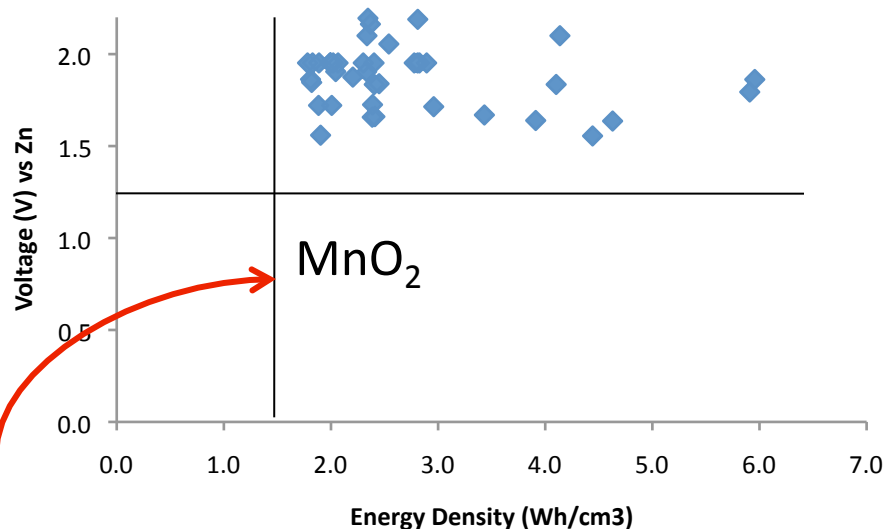
Tier 2



≈ 200 compounds

- ✓ Reactant stable in air
- ✓ Reactant stable in 9N KOH
- ✓ Product stable in 9N KOH

Predicted alkaline cathode material performance



Several patents filed by Duracell

**Bi5+**

**Ni<sup>4+</sup>**

End result – 200 compounds predicted to outperform current cathode AND are predicted stable (through entire reaction) in 9 M KOH

# But what about Bismuth availability?

- ✓ Not too expensive (~\$20-30/kg)
- ✓ Low global production (by-product of lead refinement)
- ✓ NO domestic production...

## World Mine Production and Reserves:

	Mine production		Reserves <sup>2</sup>
	2010	2011 <sup>e</sup>	
United States	—	—	—
Bolivia	90	100	10,000
Canada	90	100	5,000
China	6,500	6,000	240,000
Kazakhstan	150	—	NA
Mexico	850	1,000	10,000
Peru	1,100	1,100	11,000
Other countries	120	200	39,000
World total (rounded)	8,900	8,500	320,000

Project focused on high energy novel materials, which was successful – however, driving force not enough to develop – just patents ...

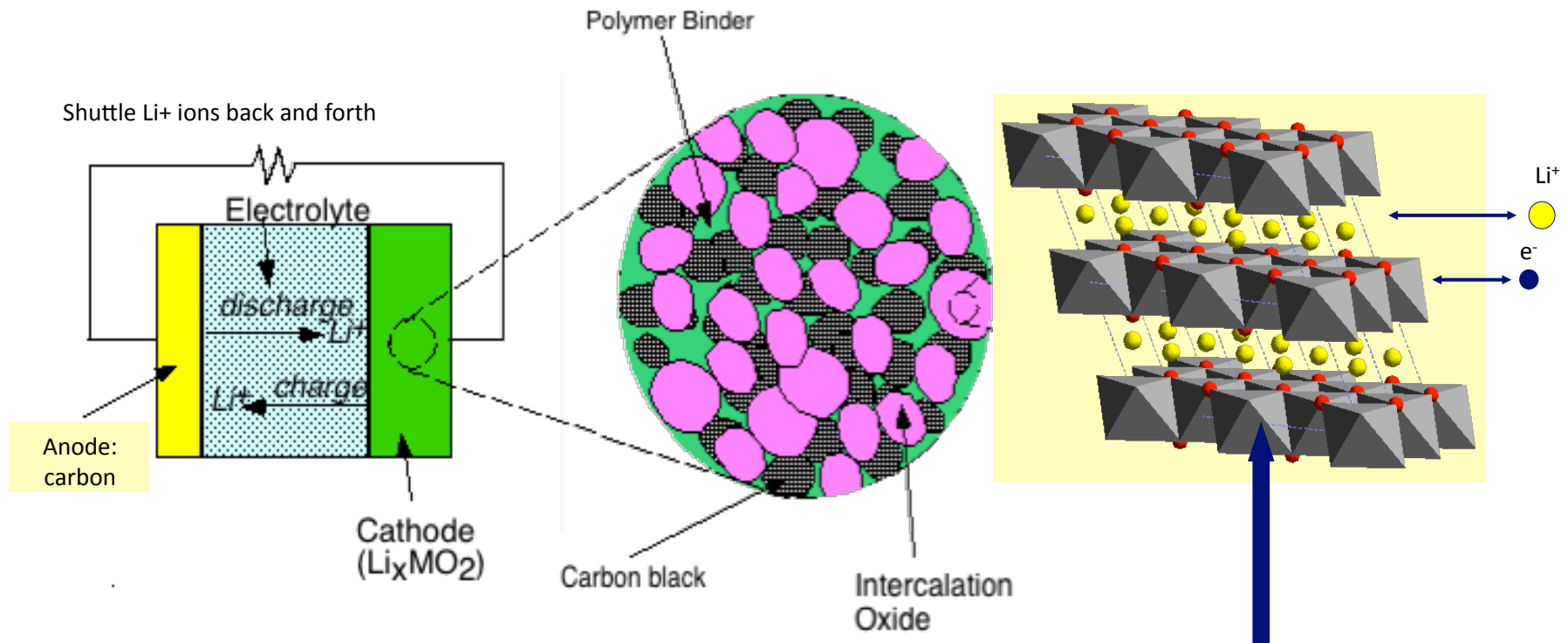


# Company Strategy



# High-throughput Materials Design: Li-ion batteries

# In Silico Materials Design: Li ion batteries

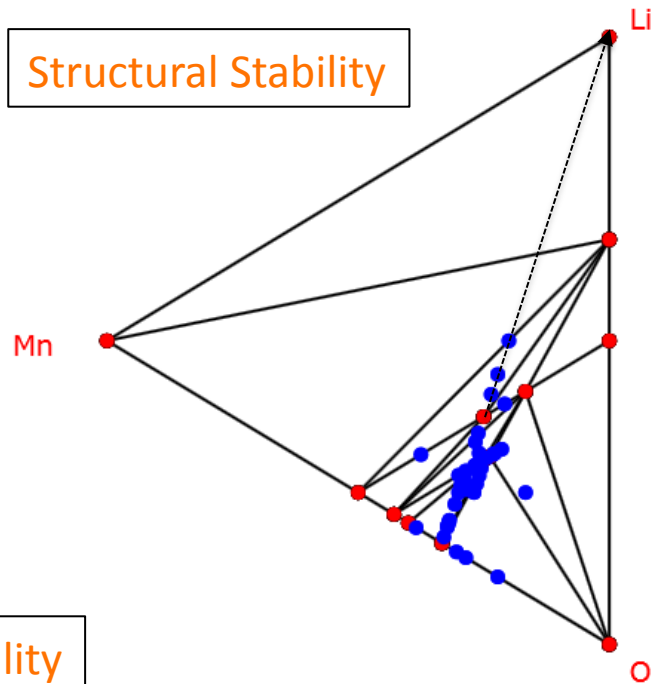
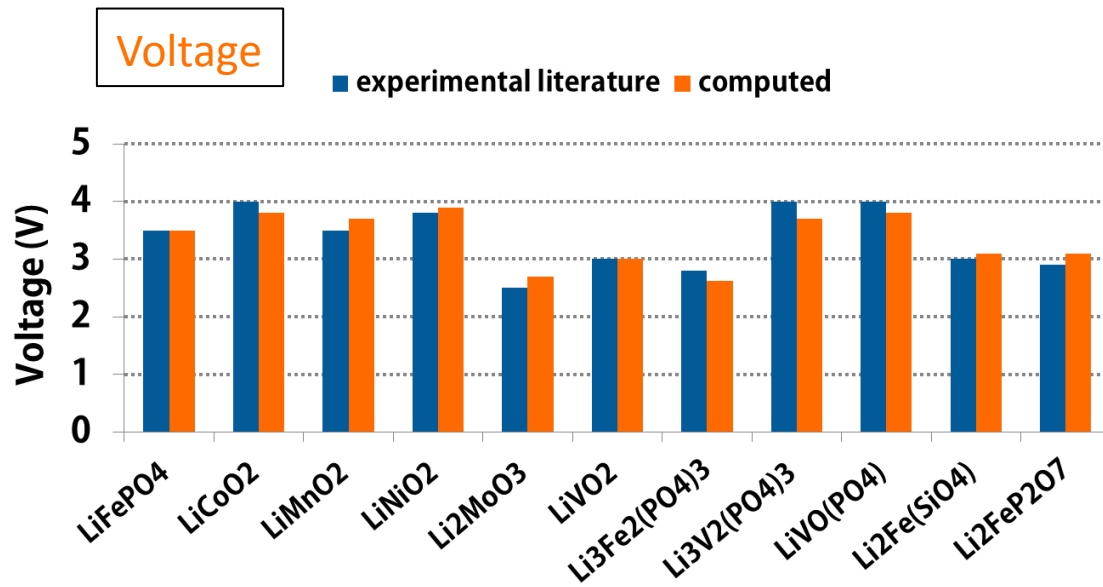


Li-ion is a family of chemistries, differentiated by cathode

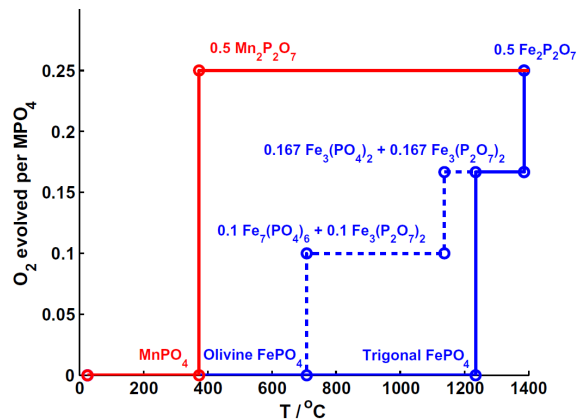
Cathode needs to host and exchange large amounts of Li<sup>+</sup> and electrons at high rate and remain stable

**Need: good capacity, voltage, rate, stability, safety, cost, ....**

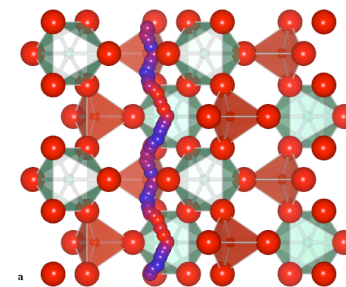
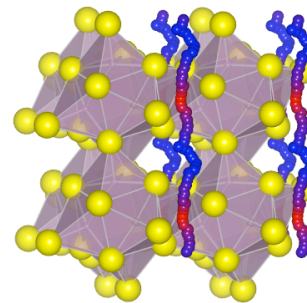
# Most are Computable



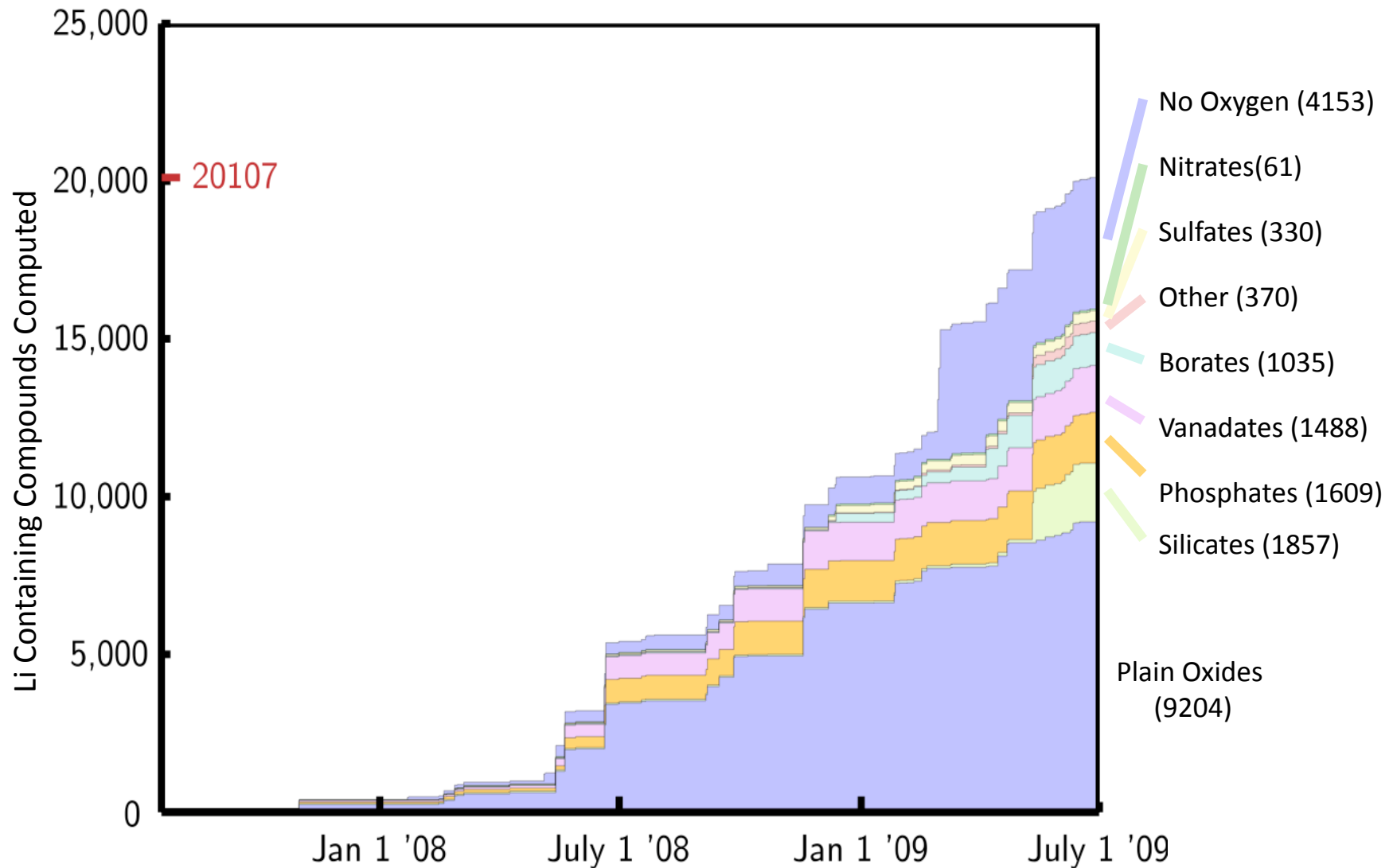
**O2 release: safety**



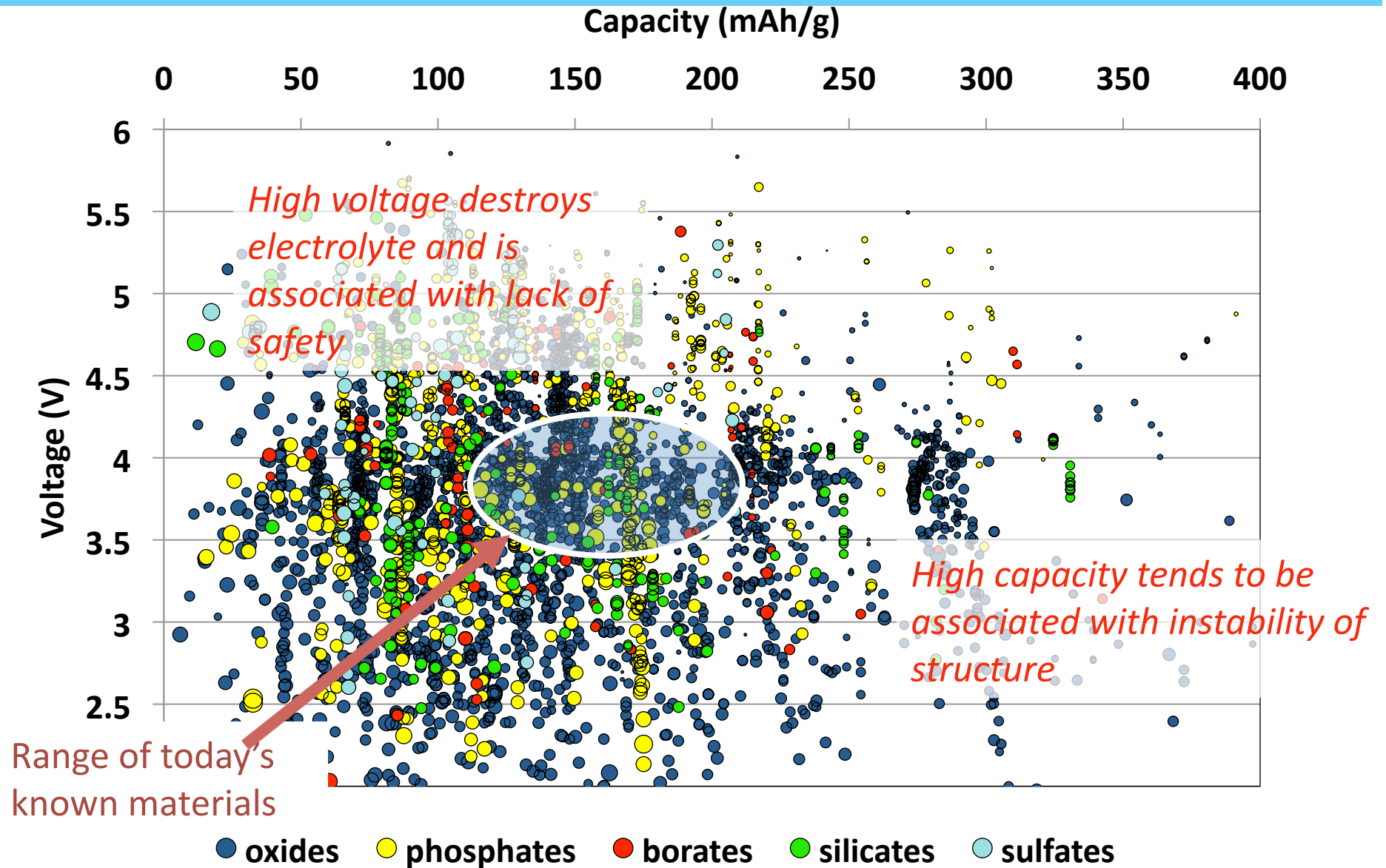
**Li mobility**



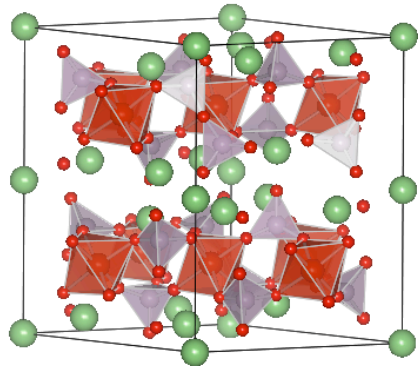
# About 25,000 battery compounds investigated so far



# Target Design Spaces

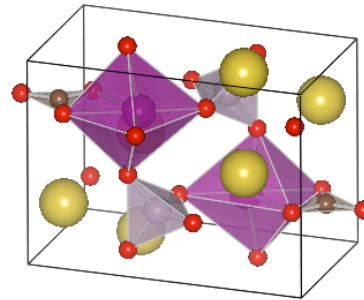


# New Li-ion Cathode Materials Discovered



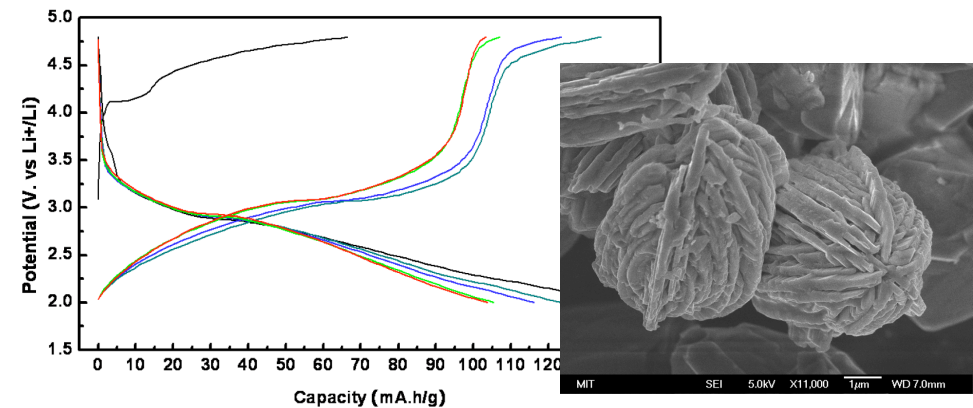
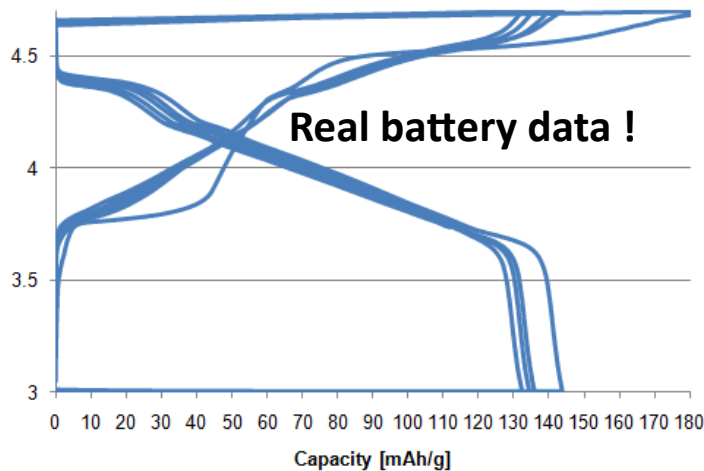
New phosphate discovered @MIT through computations

*No Li containing carbonophosphates AT ALL are known in nature !*



Completely new *class* of materials synthesized based on computational predictions

“Sidorenkites”:  $\text{Li}_3\text{M}(\text{CO}_3)(\text{PO}_4)$  (M = Fe, Mn, Ni, Co)



Courtesy of Ceder et al, MIT

Courtesy of Ceder et al, MIT

# The Materials Project: A Growing Public Resource



# Bringing information to YOU

What are the properties of known materials?

What new, useful materials might exist?

How can I optimize a material over multiple criteria?



**Often, 'experience' of individuals is the only guide**



# The **MATERIALS** **PROJECT**

a materials genome approach

*Formerly the "Materials Genome Project"*

A public Project to compute "all" properties of all inorganic materials



[www.materialsproject.org](http://www.materialsproject.org)

# The **MATERIALS** **PROJECT**

## Goals

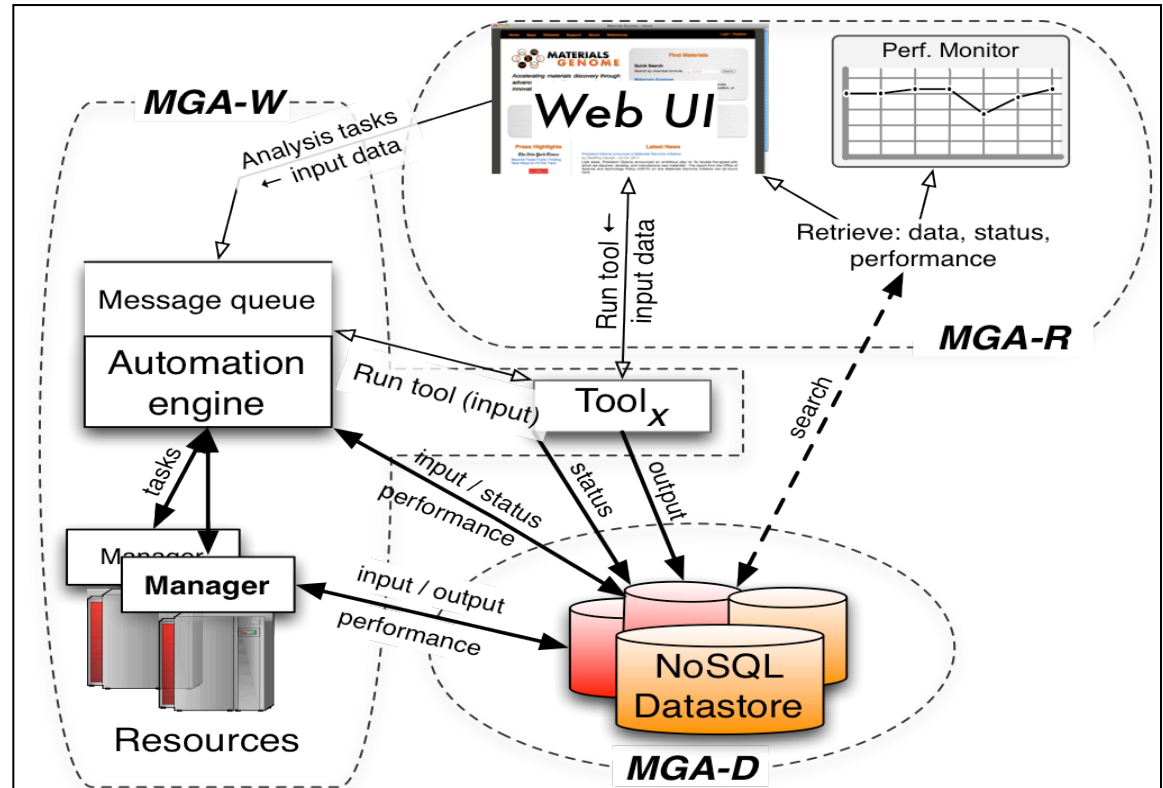
- Fill in 'missing' property data on all known compounds
- Assist researchers in predicting new materials
- Provide interactive analysis tools and codes
- Enable rapid screening and data mining



# The MATERIALS PROJECT

Large machinery under the hood to manage:

- ✓ Input data
- ✓ Runs
- ✓ Output
- ✓ Analyses
- ✓ Web interface



## LBL NERSC

Kathy Yelick  
David Skinner  
Shreyas Cholia  
Daniel Gunter  
Annette Greiner

## MIT

Gerbrand  
Ceder  
Shyue Ping Ong  
Geoffroy Hautier

## LBL CRD

David Bailey  
Anubhav Jain

## LBL EETD

Kristin  
Persson  
Michael Kocher

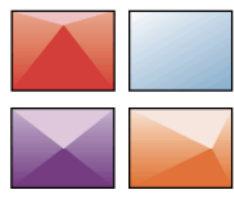
- ❑ Over 20,000 compounds and growing daily
- ❑ Multiple tools based on computed data



### PhaseDiagramApp

The Phase Diagram App uses density functional theory calculations from our database to generate **0K compositional and grand potential phase diagrams** of two to four components. For details of our methodology, see the [Phase Diagram App manual](#).

*HTML5-compatible browser recommended, e.g., Chrome, Safari. Non-interactive plots only for IEB.*



### StructurePredictor

Predicting new compounds and their crystal structures is the first step in finding new materials for future technologies. The structure predictor uses data-mined knowledge of experimental crystal data to generate potential new compounds (ionic systems only). **Note:** processing can take several days.




### LithiumBatteryExplorer

The Battery Explorer is a customized tool to search the Materials Project database for lithium battery materials satisfying various critical criteria such as voltage, capacity, stability and energy density. For details and usage tips, please refer to the [Battery Explorer manual](#).


Because of error cancellation, intercalation voltages are expected to be more accurate than conversion voltages.

This app currently contains **214** lithium intercalation compounds and **4158** conversion battery compounds. If you can't find the compound you're looking for, please check back later. We add new ones every week!



### MaterialsExplorer

Search for materials information by chemistry, composition, or property.



### ReactionCalculator

The reaction calculator determines energies of solid state reactions using a database of Density Functional Theory calculations. When available, the reaction calculator will also report experimental formation enthalpies for the reaction. For details of our methodology and usage tips, please refer to the [manual](#).

Usage Example: Type "MgO + Al2O3" in the Reactants field and "MgAl2O4" in the Products field and click "Calculate ΔH".



### CrystalToolkit

CrystalToolkit is a structure editor that generates new structures from existing structures in the Materials Project or from an uploaded POSCAR or CIF file. Batch processing of structures is supported.

# The MATERIALS PROJECT

# Data

PhaseDiagramApp investigate phase stability for 2-4 component systems

Phase Diagrams via Density Functional Theory Version 0.3

The Phase Diagram App (PDApp) generates phase diagrams using the Materials Genome database. Compositional and grand potential phase diagrams of up to four compositional components are supported.

Phase diagrams represent the thermodynamic phase equilibria of multicomponent systems and reveal useful insights into fundamental material aspects regarding the processing and reactions of materials.

For the detailed methodology used and usage tips, please refer to the PDApp manual.

HTML5-compatible browser recommended, e.g., Chrome, Safari, Firefox (3.6 and above) and IE9. Non-interactive plots only for IE8.

Control Center: LI-Co-O PD

Co-Li-O Phase Diagram

Show Data Table Show Unstable Mark Comp Get PNG Interpreting PDS

copyright© 2010-11 Materials Genome, db 1.1

Database version 1.1

Need additional capabilities? E-mail collaborate [at] materialsgenome.org

Questions? E-mail support [at] materialsgenome.org

Phase diagrams  
with available data:  
**28,300**  
**SYSTEMS**

Home About Apps Datasets Support Contact

### ReactionCalculator

The reaction calculator determines energies of solid state reactions using a database of Density Functional Theory calculations. When available, the reaction calculator will also report experimental formation enthalpies for the reaction.

The current database contains computations for over 23,000 solid state materials and experimental data for over 1,000 solid state compounds.

The user must specify a set of reactants and products that are comma-separated. There is no need to balance the reaction.

**Usage Example:**  
In 'Reactants input', put the text: MgO, Al2O3  
In 'Products input', put the text: MgAl2O4  
(leave 'Advanced Arguments' blank)

Comprehensive details may be found in the reaction calculator manual.

Reactants Input: MgO, Al2O3

Products Input: MgAl2O4

Advanced Arguments

Energy Adjustments [?] (Default: adjust many gases, mix GGA/GGA+U)

Calculate

MgO + Al<sub>2</sub>O<sub>3</sub> → MgAl<sub>2</sub>O<sub>4</sub>

ΔE of reaction, (comp, 0K): -0.4024 eV (-38.83 kJ)  
MgO - ΔE<sub>f</sub>: -6.173 eV (-595.61 kJ)  
Al<sub>2</sub>O<sub>3</sub> - ΔE<sub>f</sub>: -17.1476 eV (-1654.51 kJ)  
MgAl<sub>2</sub>O<sub>4</sub> - ΔE<sub>f</sub>: -23.723 eV (-2288.94 kJ)

ΔH of reaction (expt, 298K): -0.369 eV (-35.6 kJ)  
MgO - ΔH<sub>f</sub>: -6.2351 eV (-601.6 kJ)  
Source: Cox, J.D., Wagman, D.D.; Medvedev, V.A., CODATA Key Values for Thermodynamics, Hemisphere Publishing Corp., New York, 1984, 1.  
Al<sub>2</sub>O<sub>3</sub> - ΔH<sub>f</sub>: -17.3673 eV (-1675.7 kJ)  
Source: Cox, J.D., Wagman, D.D.; Medvedev, V.A., CODATA Key Values for Thermodynamics, Hemisphere Publishing Corp., New York, 1984, 1.  
MgAl<sub>2</sub>O<sub>4</sub> - ΔH<sub>f</sub>: -23.9713 eV (-2312.9 kJ)  
Source: O. Kubaschewski, G. Alcock, P. Spencer, Materials Thermochemistry, 6th ed., Oxford, Pergamon Press, 1993.

Database version 1.1

Need additional capabilities? E-mail collaborate [at] materialsgenome.org

Questions? E-mail support [at] materialsgenome.org

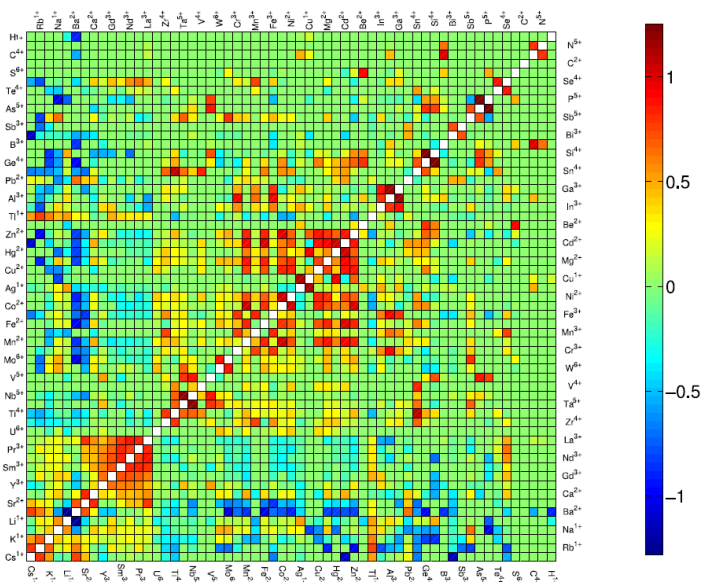
Reaction energies  
already available online:  
**>35,000**  
**REACTIONS**

# The MATERIALS PROJECT

## Structure Predictor

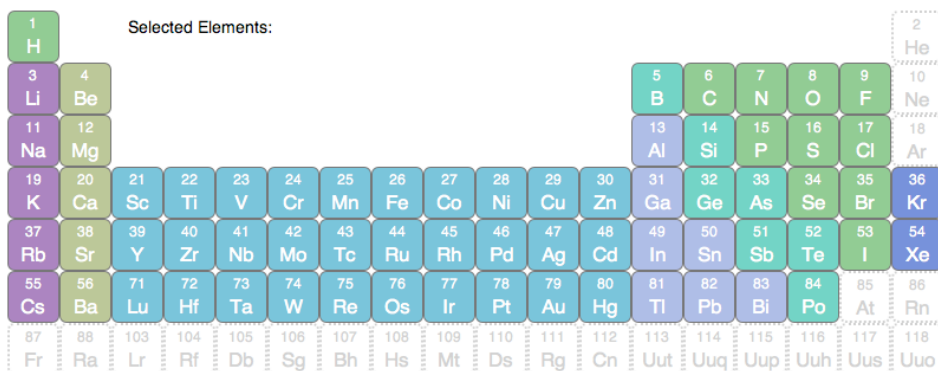


Predict new compounds using data-mined substitution algorithms.



Hautier, Fischer, Erlacher, Jain, Ceder  
*Inorganic Chemistry (2010)*

### Step 1: Select elements



MATERIALS PROJECT Home Apps Support About References kaperson@lbl.gov | Logout

### StructurePredictor Result 255

Selected species	Nb:[5] O:[-2] Ti:[4]
Threshold	-4
Created at	Oct. 18, 2011, 8:48 a.m.
Completed at	Oct. 18, 2011, 4:05 p.m.
Computational time	10275 sec
Number of crystals	23

#### Candidate Structures

Show 50 entries Search: \_\_\_\_\_

Ranking	ID	Score	Chemical Formula	Number of Sites	CIF
1	189	-3.8932	Ti <sub>2</sub> Nb <sub>2</sub> O <sub>9</sub>	26	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
2	190	-3.8932	Ti <sub>2</sub> Nb <sub>2</sub> O <sub>9</sub>	52	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
3	173	-3.8022	Ti <sub>4</sub> Nb <sub>19</sub> O <sub>33</sub>	150	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
4	183	-3.8022	TiNb <sub>2</sub> O <sub>7</sub>	20	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
5	184	-3.7108	TiNb <sub>2</sub> O <sub>7</sub>	60	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
6	175	-3.6103	Ti <sub>4</sub> Nb <sub>2</sub> O <sub>13</sub>	19	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
7	188	-3.5608	Ti <sub>2</sub> Nb <sub>2</sub> O <sub>9</sub>	52	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
8	172	-3.5032	Ti <sub>2</sub> Nb <sub>17</sub> O <sub>29</sub>	41	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
9	177	-3.4582	Ti <sub>4</sub> Nb <sub>2</sub> O <sub>13</sub>	38	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
10	186	-3.3965	TiNb <sub>2</sub> O <sub>7</sub>	20	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
11	192	-3.3965	TiNb <sub>4</sub> O <sub>12</sub>	17	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
12	182	-3.3950	TiNb <sub>2</sub> O <sub>7</sub>	1080	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
13	187	-3.3950	TiNb <sub>2</sub> O <sub>7</sub>	40	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
14	181	-3.3448	TiNb <sub>2</sub> O <sub>7</sub>	1080	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
15	194	-3.3448	Ti <sub>3</sub> Nb <sub>4</sub> O <sub>20</sub>	116	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
16	191	-3.3046	TiNb <sub>4</sub> O <sub>12</sub>	68	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
17	174	-3.1551	Ti <sub>3</sub> Nb <sub>2</sub> O <sub>11</sub>	32	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
18	176	-3.1551	Ti <sub>4</sub> Nb <sub>2</sub> O <sub>13</sub>	76	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>
19	179	-3.0800	TiNb <sub>2</sub> O <sub>7</sub>	20	<a href="#">Crystal Structure (CIF)</a> <a href="#">[Download Link]</a>

# The MATERIALS PROJECT

# Safety



## LithiumBatteryExplorer

The Battery Explorer is a customized tool to search the Materials Project database for lithium battery materials satisfying various critical criteria such as voltage, capacity, stability and energy density. For details and usage tips, please refer to the [Battery Explorer manual](#).

Because of error cancellation, intercalation voltages are expected to be more accurate than conversion voltages.

This app currently contains **214** lithium intercalation compounds and **4158** conversion battery compounds. If you can't find the compound you're looking for, please check back later. We add new ones every week!

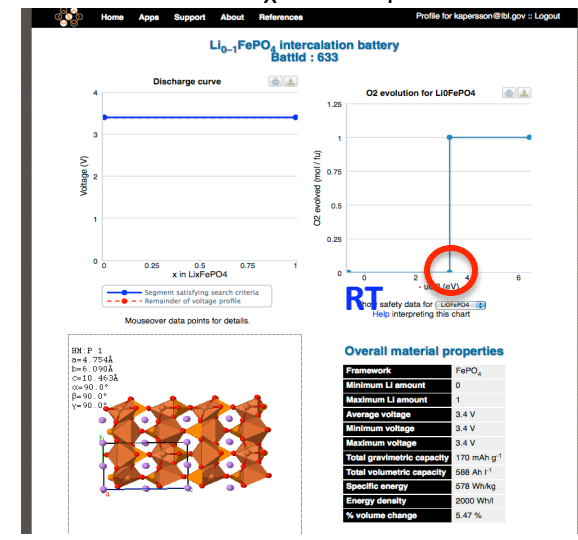
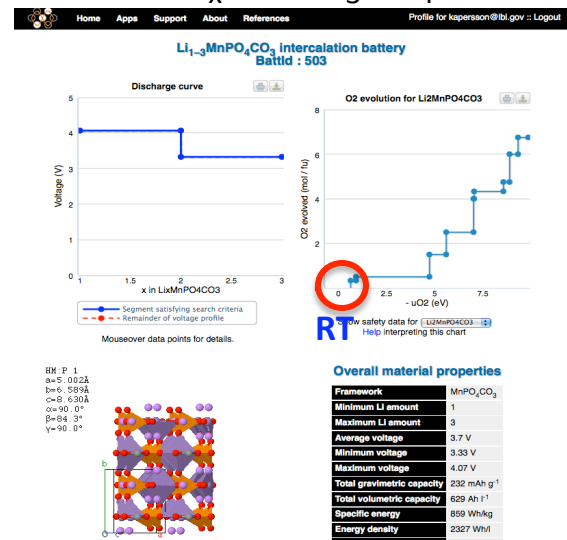
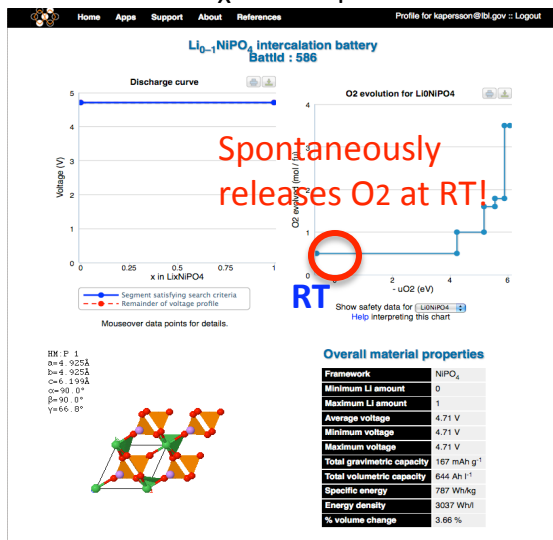
Oxygen release correlates with oxygen chemical potential of cathode



safer →



safer →

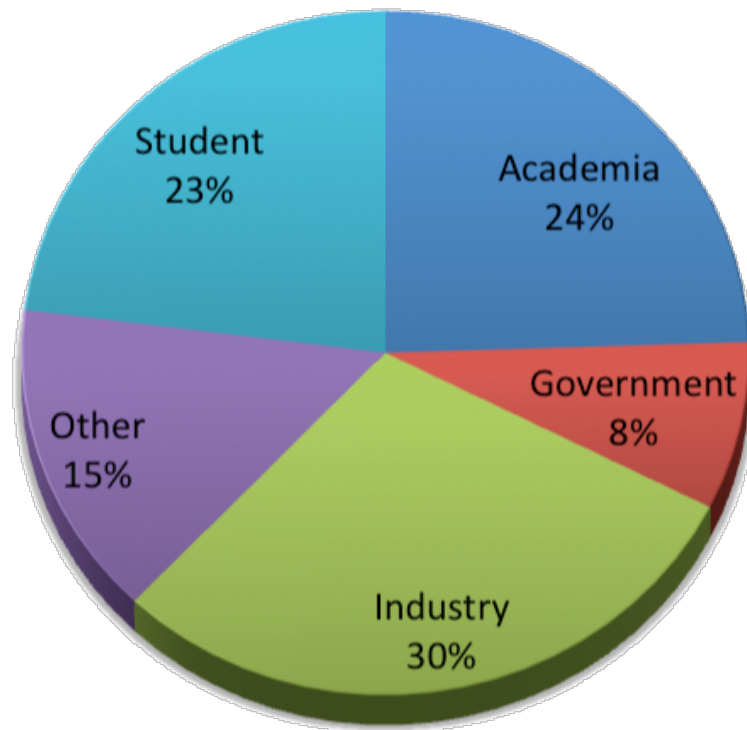




# The **MATERIALS** **PROJECT**

## Usage

Launched Oct 11 2011



☐ >2,000 registered users

☐ > 6000 phase diagrams generated

☐ > 7000 structure predictions executed



Lawrence Berkeley  
National Laboratory

Kristin Persson  
David Bailey  
Michael Kocher  
Anubhav Jain  
Daniel Gunter



MASSACHUSETTS  
INSTITUTE OF  
TECHNOLOGY

Gerbrand Ceder  
Shyue Ping Ong  
Evgenii Chtykov



National Energy Research  
Scientific Computing Center

David Skinner  
Shreyas Cholia  
Annette Greiner

**UCL**  
Université Catholique de  
Louvain, Belgium

Geoffroy Hautier



Alan Dozier  
Matthew J. Beck



University of California,  
Berkeley

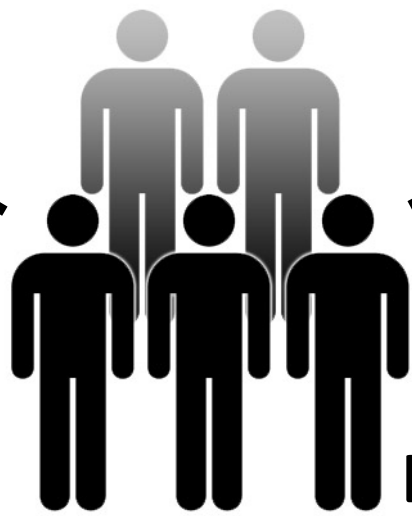
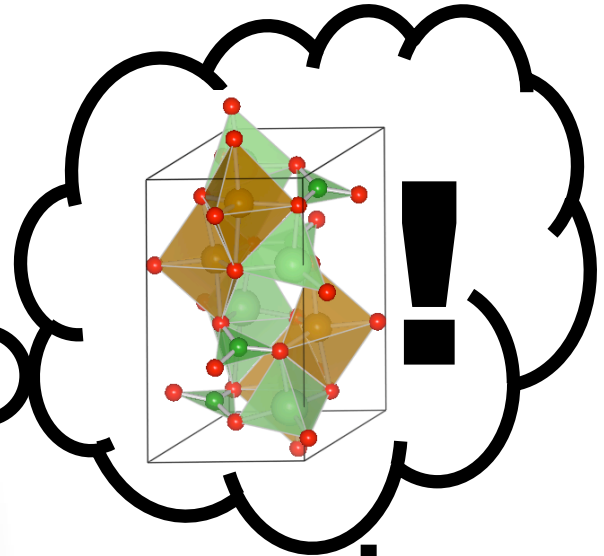
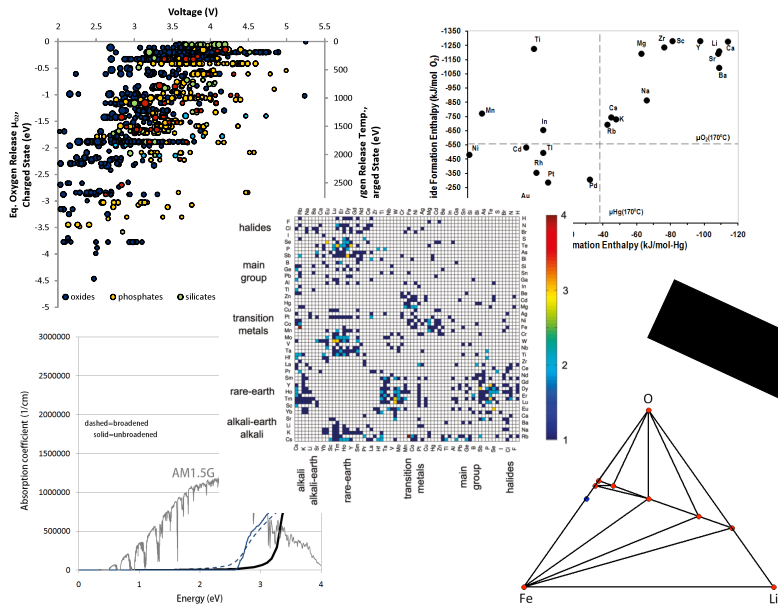
Mark Asta



Stefan Adams

[www.materialsproject.org](http://www.materialsproject.org)

# The Materials Genome Revolution



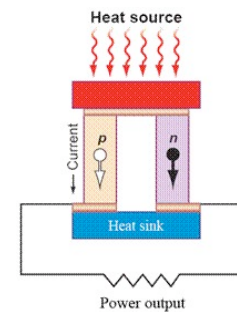
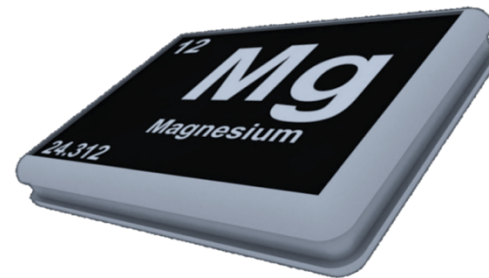
**LBNL/MIT + partners**

**“bringing science solutions to the world”**

# The **MATERIALS** **PROJECT**

Current and Planned  
Application areas

- Alkaline battery cathodes
- Li-ion battery electrodes
- Na-ion battery electrodes
- Electrolytes
- Rechargeable Mg-ion batteries
  
- Solid State Ion conductors
  
- Hg capture from gas streams
  
- Corrosion/Stability in Water
- Photocatalysts
- Thermoelectrics
  
- Surface energies and nanoparticles



Applications are often created in  
collaboration with companies



## The Google of Materials Properties is arriving

- ❑ Materials are the cornerstone of many applications
- ❑ Materials properties can be predicted by computations: **ab initio + other methods.**
- ❑ We will reach the point where properties of all materials are computed: **A Materials Genome**

*[www.materialsproject.org](http://www.materialsproject.org)*

# The MATERIALS PROJECT

## Recognition



### Materials Genome Initiative: A Renaissance of American Manufacturing

June 2011: **Materials Genome Initiative** which aims to *“fund computational tools, software, new methods for material characterization, and the development of open standards and databases that will make the process of discovery and development of advanced materials faster, less expensive, and more predictable”*

The **Materials Project** was recognized by several agencies and publicized at DOE as a ‘First-Of-Its-Kind Search Engine’ for materials research and a groundbreaking project within the recent **Materials Genome Initiative** announcement.



Home

### First-Of-Its-Kind Search Engine Will Speed Materials Research

November 3, 2011 - 1:05pm

Washington, D.C. – Researchers from the Department of Energy’s (DOE’s) Lawrence Berkeley National Laboratory (Berkeley Lab) and the Massachusetts Institute of Technology (MIT) jointly launched today a groundbreaking new online tool called the Materials Project, which operates like a “Google” of material properties, enabling scientists and engineers from universities, national laboratories and private industry to accelerate the development of new materials, including critical materials.

“By accelerating the development of new materials, we can drive discoveries that not only help power clean energy, but also are used in common consumer products.” said Secretary of Energy Steven Chu. “This research tool will help the United States compete with other developers of new materials, and could potentially create new domestic industries.”

Discovering new materials and strengthening the properties of existing materials are key to improving just about everything humans use – from buildings and highways to modern necessities. For example, advances in a group of materials called “critical materials” are more important to America’s competitiveness than ever before – particularly in the clean energy field. Cell phones,

The End