

Structural Prediction and Materials Design

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Outline

Motivation

High-throughput and global minima optimization methods

Materials Design

Application

Conclusions

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Inorganic crystals and technology



Inorganic crystals present in many technological applications

- ▶ Electronic devices
- ▶ Thermoelectrics
- ▶ Superconductors
- ▶ Heavy industrial applications
- ▶ ...

Inorganic crystals and technology



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 - ▶ ...
1. Some applications still miss a proper material
 2. Different materials for different applications

How much of the (chemical) world do we actually know?



Inorganic crystals in the ICSD: 210,229

- Alloys
- Duplicates
- Incomplete entries

► 70,000 well defined compounds

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What if none of these materials fits our needs?

Materials prediction

Search space is enormous!

- ▶ Systematic experimental synthesis very expensive and time-consuming

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Explore with computer simulations and synthesize only the best candidates

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High-throughput methods

Nature often chooses the same solution to similar problems

High-throughput methods

Nature often chooses the same solution to similar problems

- ▶ One takes a known structure, change its chemical composition, and hope that this will also be a stable phase for the new composition
- ▶ Chemical composition varied by brute force or by ML algorithms

High-throughput methods

Pros

- ▶ Very efficient
- ▶ Able to screen thousands of compounds with limited computing resources

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Cons

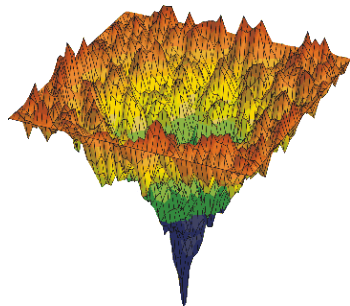
- ▶ Impossibility to discover any material with different crystal structure than of similar compounds already contained in the databases

Global Structural Prediction methods

Given the chemical composition of a solid, obtain its ground-state structure

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Given the chemical composition of a solid, obtain its ground-state structure



- ▶ Potential energy surface (PES): function that gives the energy of a molecule / crystal as a function of its geometry
- ▶ Number of possible minima in a solid increases exponentially with the number of atoms

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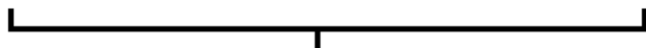
Conclusions

Materials Design

Given a certain property, discover the material that possesses this property

Genetic Algorithms

[X X Li O P Hg] [X C C Na Rb W]



Crossover



[X Li C C P Hg]

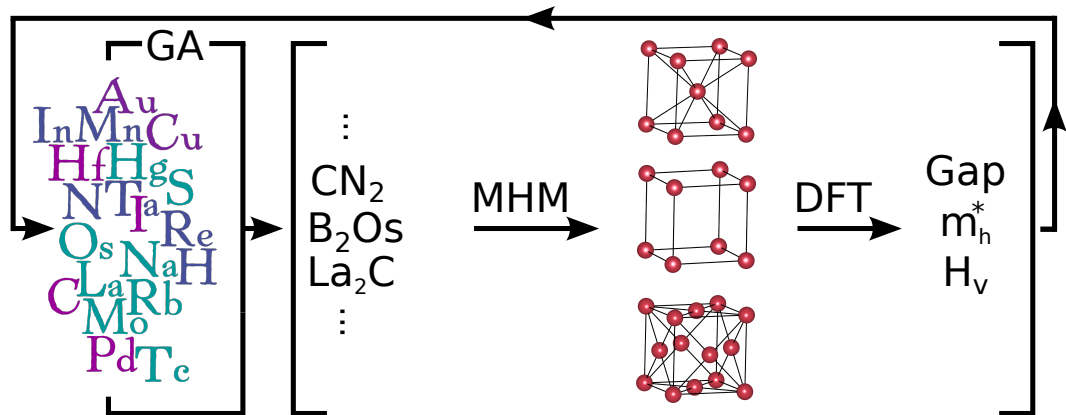


Mutation



[X Li C C S Hg]

Materials Design



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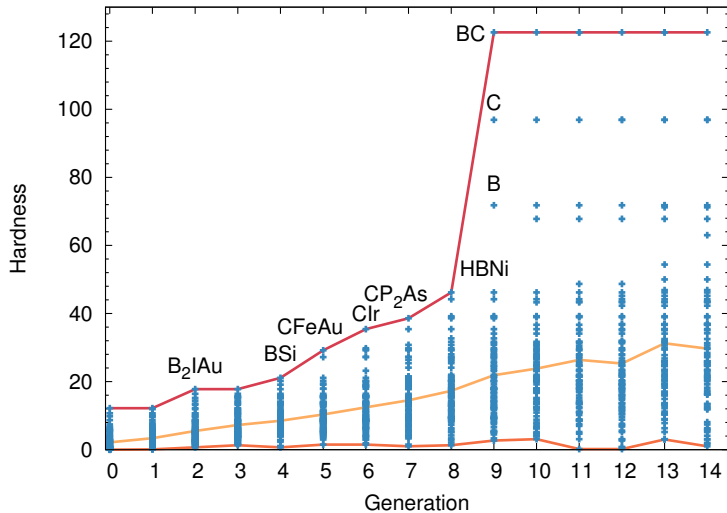
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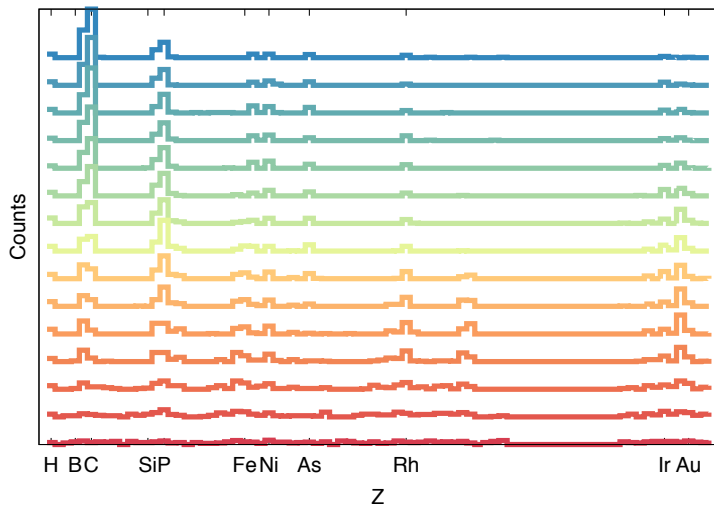
Search for super-hard materials

- ▶ Super-hard material: Vickers hardness > 40
- ▶ Best known solution is accessible: diamond
- ▶ Random initial generation

Search for super-hard materials



Search for super-hard materials



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- ▶ Numerical simulations very efficient for materials prediction / screening
- ▶ Design materials with tailored properties without any experimental input
- ▶ Efficient with current computer resources
- ▶ Completely general: it can be used to design materials optimised for any property(ies)

Thank you

