

# MATERIALSCLOUD

### The Materials Cloud

Writing reproducible workflows using AiiDA May 21st-24th, 2019, Lausanne













### **High-Throughput**

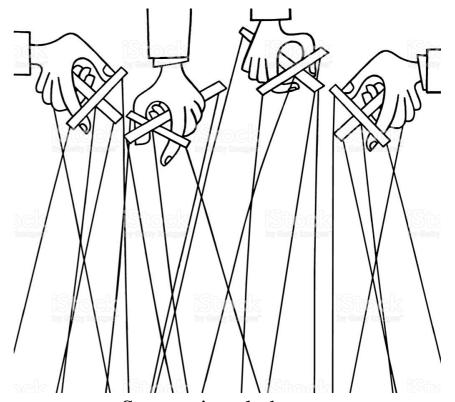
Reproducibility

**Open Data** 

**Knowledge Transfer** 

- Organize large numbers of calculations
- Deal with corner cases (theory, code, infrastructure)
- Many strings to pull











**High-Throughput** 

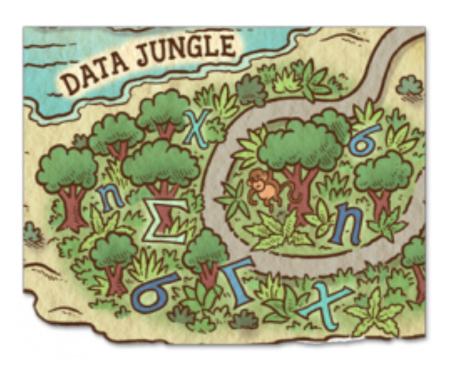
### Reproducibility

**Open Data** 

**Knowledge Transfer** 

- Keep track of what you calculate
- Keep track of how you did it
- Within a research group:
   Can Alice reproduce what Bob computed 1 year ago?





Source: academiccoachingandwriting.org





**High-Throughput** 

Reproducibility

**Open Data** 

**Knowledge Transfer** 

- Open Data
  - Supporting Information
  - Just upload everything
  - FAIR data
- Making data FAIR is hard, can we make it easier?





















**High-Throughput** 

Reproducibility

**Open Data** 

**Knowledge Transfer** 

- Share a workflow for your code with a collaborator or company
- Share the environment needed to run the workflow
- Reduce email traffic by sharing access to live dashboards with simulation results





Source: quote.ucsd.edu







### **Materials Cloud**

- AiiDA is the 'engine', like Git used in production since 2015
- Materials Cloud is the dissemination platform (like GitHub) and more (cloud computing and data generation platform) online since Dec 2017

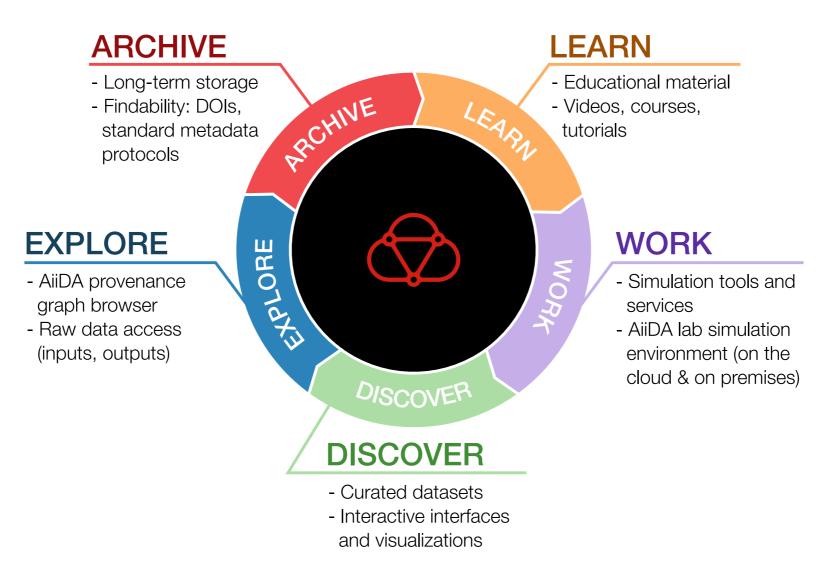






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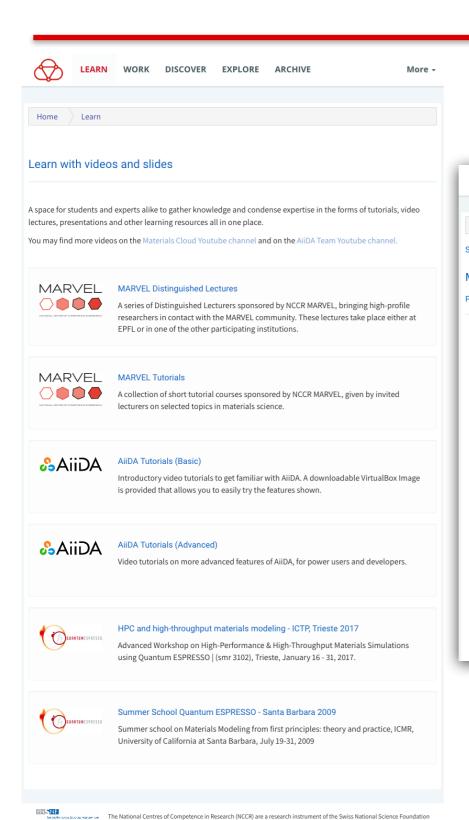


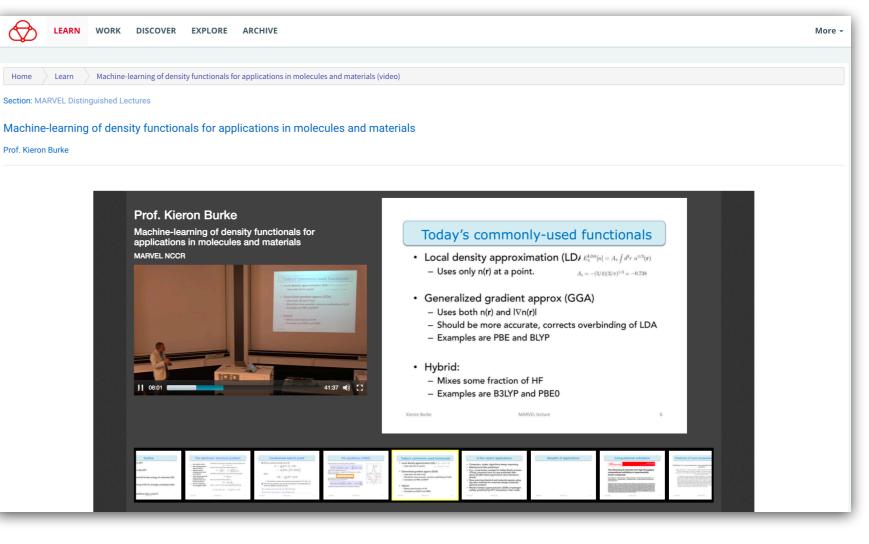






### **LEARN**











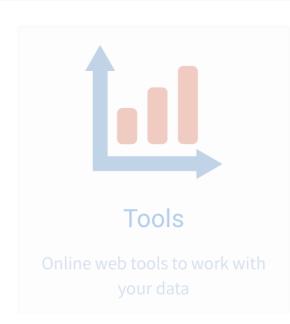


**DISCOVER** 

**EXPLORE** 

**ARCHIVE** 

More -









### **AiiDA Lab**

- Comes with a preconfigured AiiDA setup, ideal interface for turn-key workflows
- Custom AppMode extension to make notebooks look&feel like real web apps knowing only python
- Using JupyterHub + DockerSpawner

### **Quantum Mobile**

- **Downloadable VM** with preinstalled **AiiDA** and codes like QE, Yambo, Fleur, Siesta, CP2K, ...
- Includes same AiiDA Lab apps environment as on Materials Cloud
- Ideal for education

**Materials Cloud** 

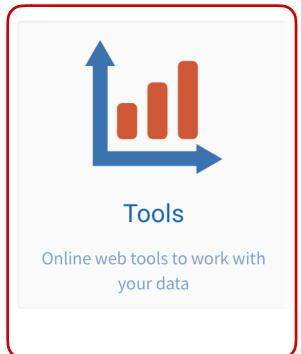


















### **Tools**

- Simple web-based applications that allow to run simulations within a few seconds (~<10-60 sec)</li>
- Useful to provide visualisation









More -

**Tools** 

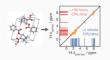
Add new tool

Computational tools offered as a service: no download, no installation, but click-and-run.



#### SeeK-path: the k-path finder and visualizer

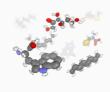
**Authors:** Yoyo Hinuma, Giovanni Pizzi, Yu Kumagai, Fumiyasu Oba, Isao Tanaka **Description:** A k-path finder that provides band paths compatible with space group symmetry, and an interactive 3D visualizer.



#### ShiftML: chemical shifts in molecular crystals by machine learning

Authors: Federico M. Paruzzo, Albert Hofstetter, Félix Musil, De Sandip, Michele Ceriotti, and Lyndon Emsley

**Description:** A machine learning model to predict the isotropic chemical shielding of molecular crystals containing H, C, N and O, and an interactive 3D visualiser.



#### AlphaML: machine learning of molecular polarizabilities

**Authors:** David M. Wilkins, Andrea Grisafi, Yang Yang, Ka Un Lao, Robert A. DiStasio Jr. and Michele Ceriotti **Description:** A machine learning framework for the prediction of molecular polarizabilities based on comparisons of local environments.



#### Interactive phonon visualizer

Authors: Snehal Kumbhar, Giovanni Pizzi, Thibault Sohier, Henrique Miranda

**Description:** A tool for the interactive visualization and inspection of lattice vibrations.



#### Synthesis condition finder

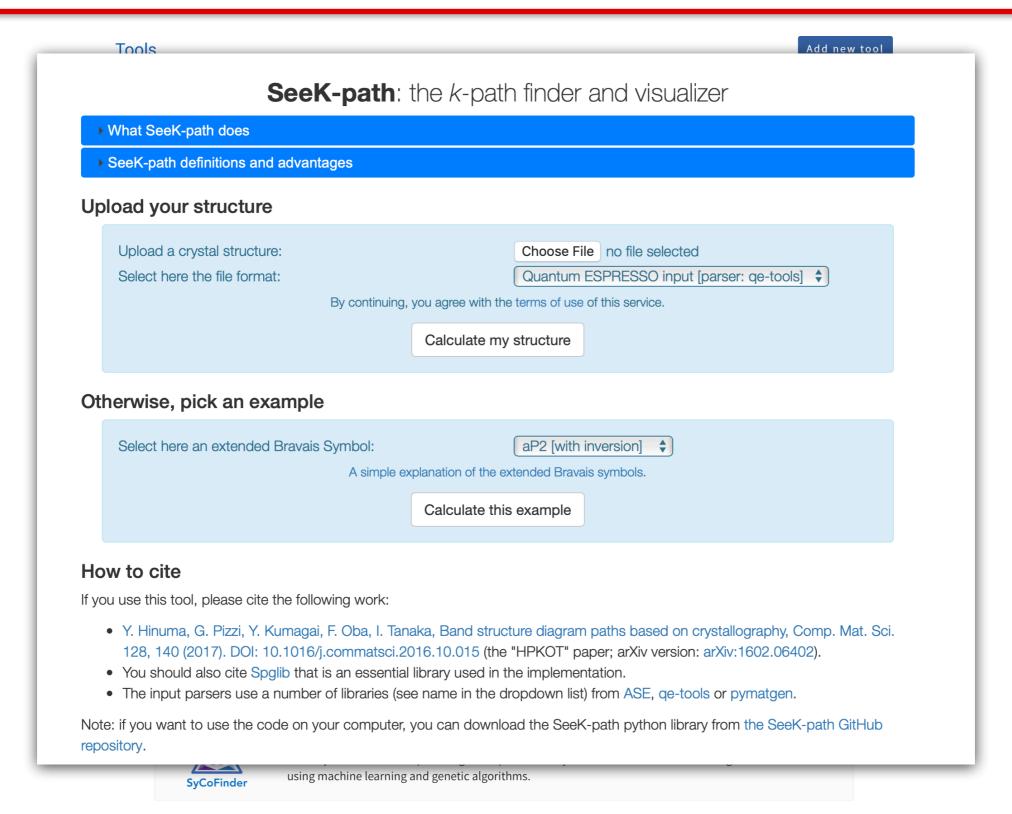
Authors: Seyed Mohamad Moosavi, Leopold Talirz

**Description:** A tool for optimizing the experimental synthesis conditions for metal-organic frameworks using machine learning and genetic algorithms.

















Add new tool Tools **SeeK-path**: the *k*-path finder and visualizer ▶ Show parsed input coordinates (please double-check here if the parser worked properly) Jump directly to downloadable coordinates Brillouin zone (go to coordinates) Primitive structure (go to coordinates) Drag to rotate, scroll to zoom, double-click to enable/disable interaction Drag to rotate, scroll to zoom, double-click to enable/disable interaction





SyCoFinder

repository.





Note: if you want to use the code on your computer, you can download the SeeK-path python library from the SeeK-path GitHub

using machine learning and genetic algorithms.

#### Reciprocal space and Brillouin-zone information

Reciprocal cell vectors (1/Å)

b<sub>1</sub> -1.2789831717 1.2789831717 1.2789831717

b<sub>2</sub> 1.2789831717 -1.2789831717 1.2789831717

b<sub>3</sub> 1.2789831717 1.2789831717 -1.2789831717

#### High-symmetry points (scaled units)

Label	k <sub>1</sub>	$k_2$	k <sub>3</sub>
Γ	0.000000000	0.000000000	0.000000000
K	0.3750000000	0.375000000	0.7500000000
L	0.500000000	0.500000000	0.500000000
U	0.625000000	0.250000000	0.6250000000
W	0.500000000	0.250000000	0.7500000000
$W_2$	0.750000000	0.2500000000	0.500000000
Χ	0.500000000	0.000000000	0.500000000

#### High-symmetry points (1/Å)

Label	k <sub>x</sub>	$k_y$	k <sub>z</sub>			
Γ	0.000000000	0.000000000	0.000000000			
K	0.9592373788	0.9592373788	0.000000000			
L	0.6394915858	0.6394915858	0.6394915858			
U	0.3197457929	1.2789831717	0.3197457929			
W	0.6394915858	1.2789831717	0.000000000			
$W_2$	0.000000000	1.2789831717	0.6394915858			
Χ	0.000000000	1.2789831717	0.000000000			
Suggested path						

 $\Gamma - X - U | K - \Gamma - L - W - X$ 

#### Structure information (primitive cell)

Crystal structure information

Bravais lattice type: cF

Extended Bravais lattice symbol: cF2 (with inversion symmetry)

Spacegroup: Fm-3m (number 225)

#### Primitive cell vectors (Å)

V<sub>1</sub> 0.0000000000 2.4563205546 2.4563205546 V<sub>2</sub> 2.4563205546 0.0000000000 2.4563205546 V<sub>3</sub> 2.4563205546 2.4563205546 0.0000000000

#### Atom coordinates (scaled)

Element	r <sub>1</sub>	r <sub>2</sub>	r <sub>3</sub>
В	0.000000000	0.000000000	0.000000000
Zr	-0.5000000000	0.500000000	0.500000000

#### Atom coordinates (Cartesian, Å)

Element	x	у	z
В	0.0000000000	0.000000000	0.000000000
Zr	2.4563205546	0.000000000	0.0000000000



using machine learning and genetic algorithms.



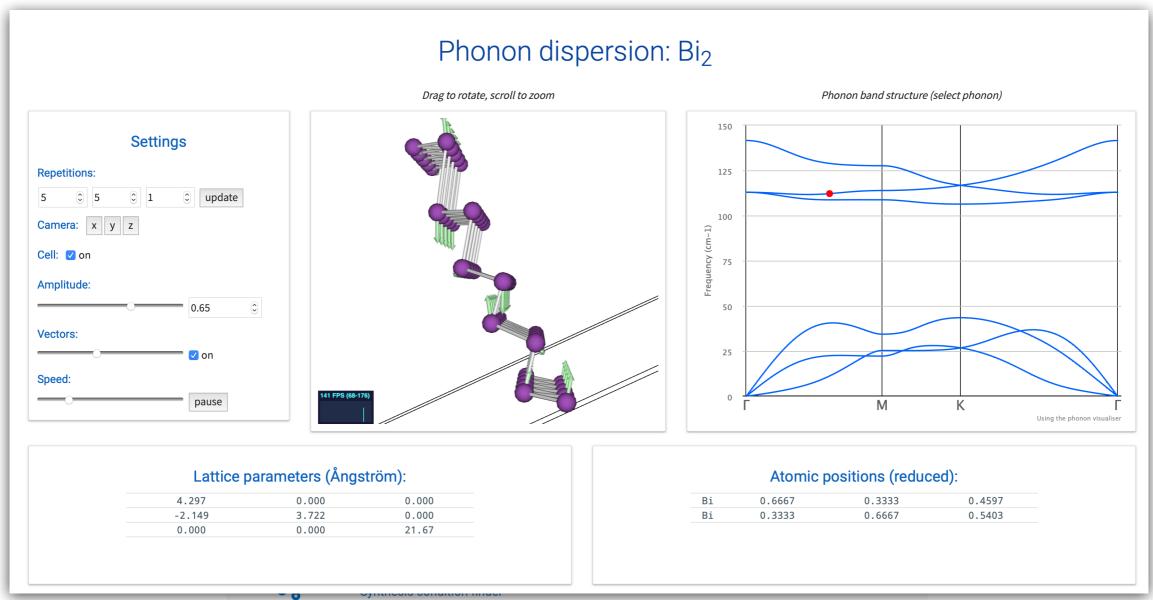






Tools Add new tool

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### Open and FAIR data sharing: Archive, Discover, Explore

### materialscloud:2017.0008

SCIENTIFIC DATA





# Two-dimensional materials from high-throughput computational exfoliation of experimentally known compounds

Authors: Nicolas Mounet<sup>1\*</sup>, Marco Gibertini<sup>1</sup>, Philippe Schwaller<sup>1</sup>, Davide Campi<sup>1</sup>, Andrius Merkys<sup>1,2</sup>, Antimo Marrazzo<sup>1</sup>, Thibault Sohier<sup>1</sup>, Ivano E. Castelli<sup>1</sup>, Andrea Cepellotti<sup>1</sup>, Giovanni Pizzi<sup>1</sup>, Nicola Marzari<sup>1\*</sup>

- 1 Theory and Simulation of Materials (THEOS), and National Centre for Computational Design and Discovery of Novel Materials (MARVEL), École Polytechnique Fédérale de Lausanne, CH-1015 Lausanne, Switzerland
- 2 Vilnius University Institute of Biotechnology, Sauletekio al. 7, LT-10257 Vilnius, Lithuania
- \* Corresponding authors emails: nicolas.mounet@epfl.ch, nicola.marzari@epfl.ch

DOI 10.24435/materialscloud:2017.0008/v2 (version v2, submitted on 21 March 2018)

#### How to cite this entry

Nicolas Mounet, Marco Gibertini, Philippe Schwaller, Davide Campi, Andrius Merkys, Antimo Marrazzo, Thibault Sohier, Ivano E. Castelli, Andrea Cepellotti, Giovanni Pizzi, Nicola Marzari, *Two-dimensional materials from high-throughput computational exfoliation of experimentally known compounds*, Materials Cloud Archive (2018), doi: 10.24435/materialscloud:2017.0008/v2.

#### Description

Two-dimensional (2D) materials have emerged as promising candidates for next-generation electronic and optoelectronic applications. Yet, only a few dozens of 2D materials have been successfully synthesized or exfoliated. Here, we search for novel 2D materials that can be easily exfoliated from their parent compounds. Starting from 108423 unique, experimentally known three-dimensional compounds we identify a subset of 5619 that appear layered according to robust geometric and bonding criteria. High-throughput calculations using van-der-Waals density-functional theory, validated against experimental structural data and calculated random-phase-approximation binding energies, allow to identify 1825 compounds that are either easily or potentially exfoliable. In particular, the subset of 1036 easily exfoliable cases provides novel structural prototypes and simple ternary compounds as well as a large portfolio of materials to search from for optimal properties. For a subset of 258 compounds we explore vibrational, electronic, magnetic, and topological properties, identifying 56 ferromagnetic and antiferromagnetic systems, including half-metals and half-semiconductors. This archive entry contains the database of 2D materials (structural parameters, band structures, binding energies, etc.) together with the provenance of all data and calculations as stored by AiiDA.

#### Materials Cloud sections using this data

- Select 2d materials via interactive periodic table and view their properties (with links to provenance)
- Explore interface providing access to the full database









### Open and FAIR data sharing: Archive, Discover, Explore

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assigned

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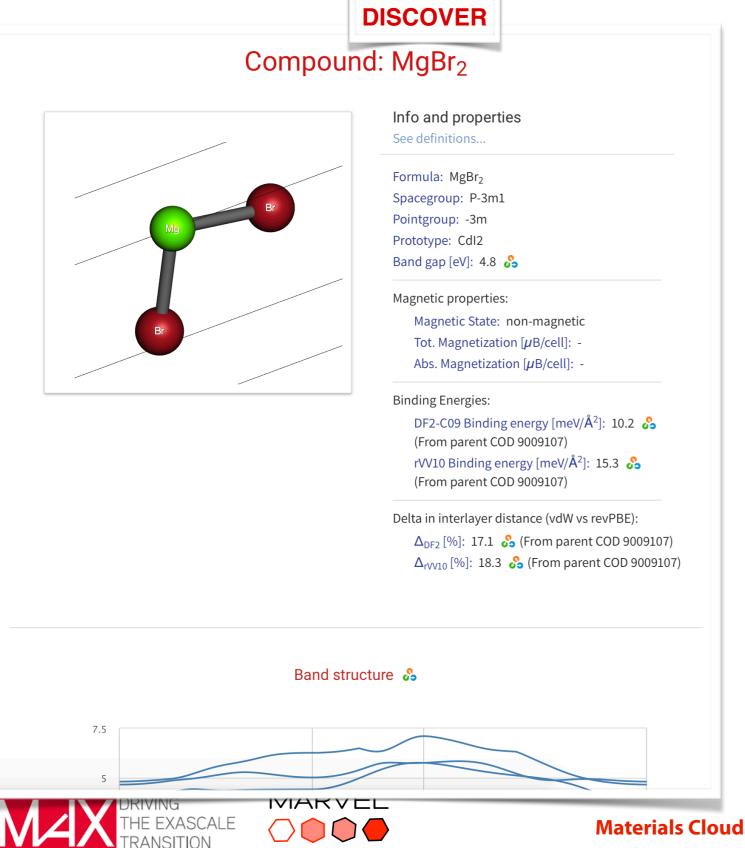




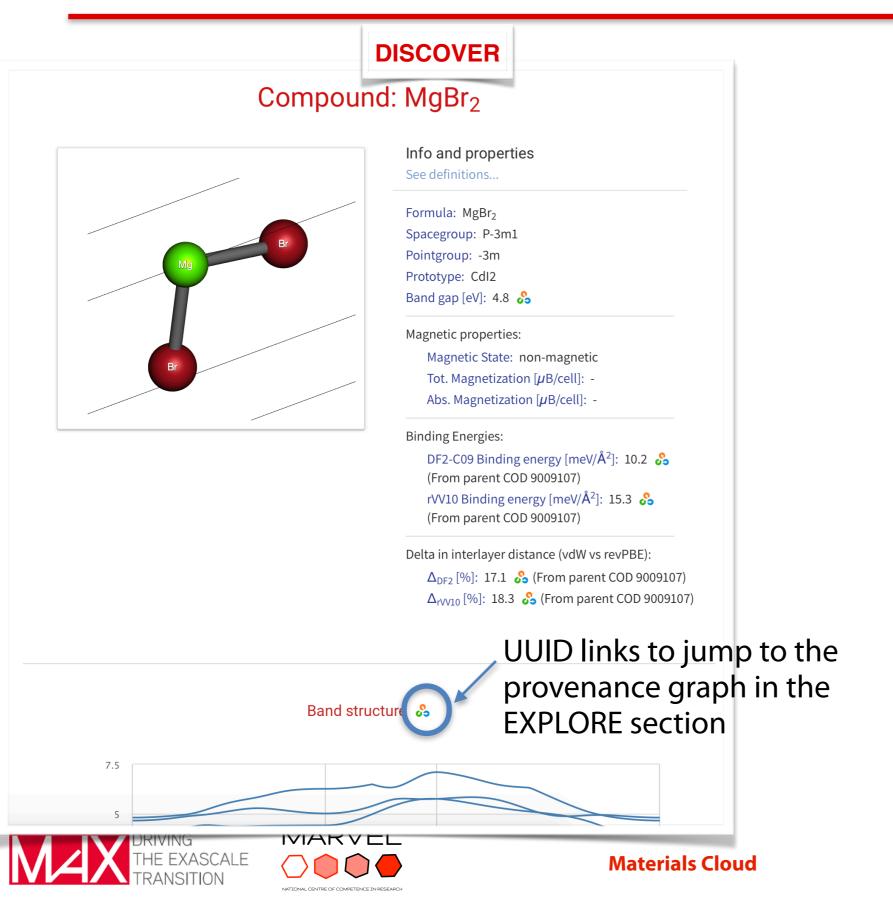


**FAIRsharing.org** re3data.org

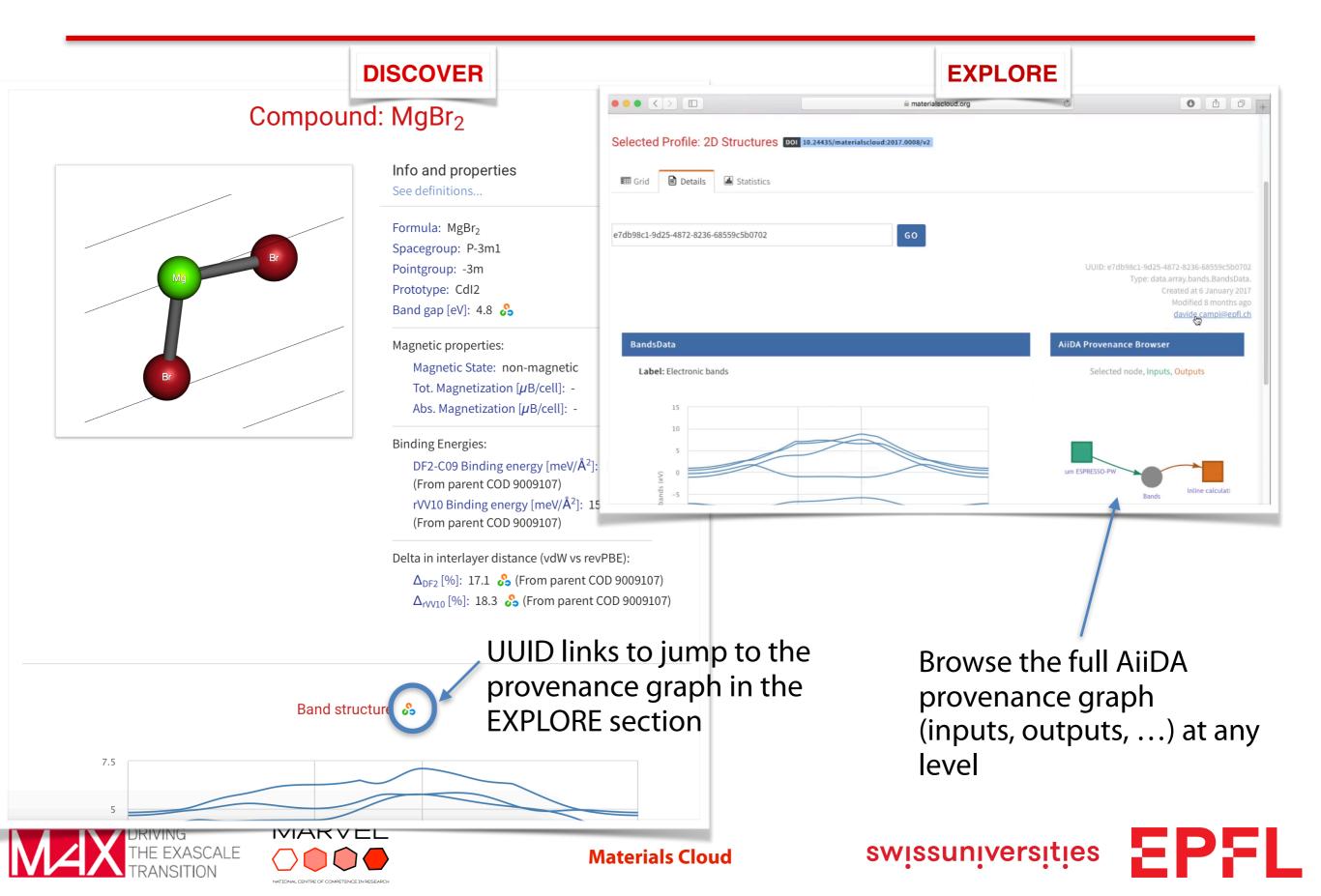
Recommended data repository by Nature's journal Scientific Data

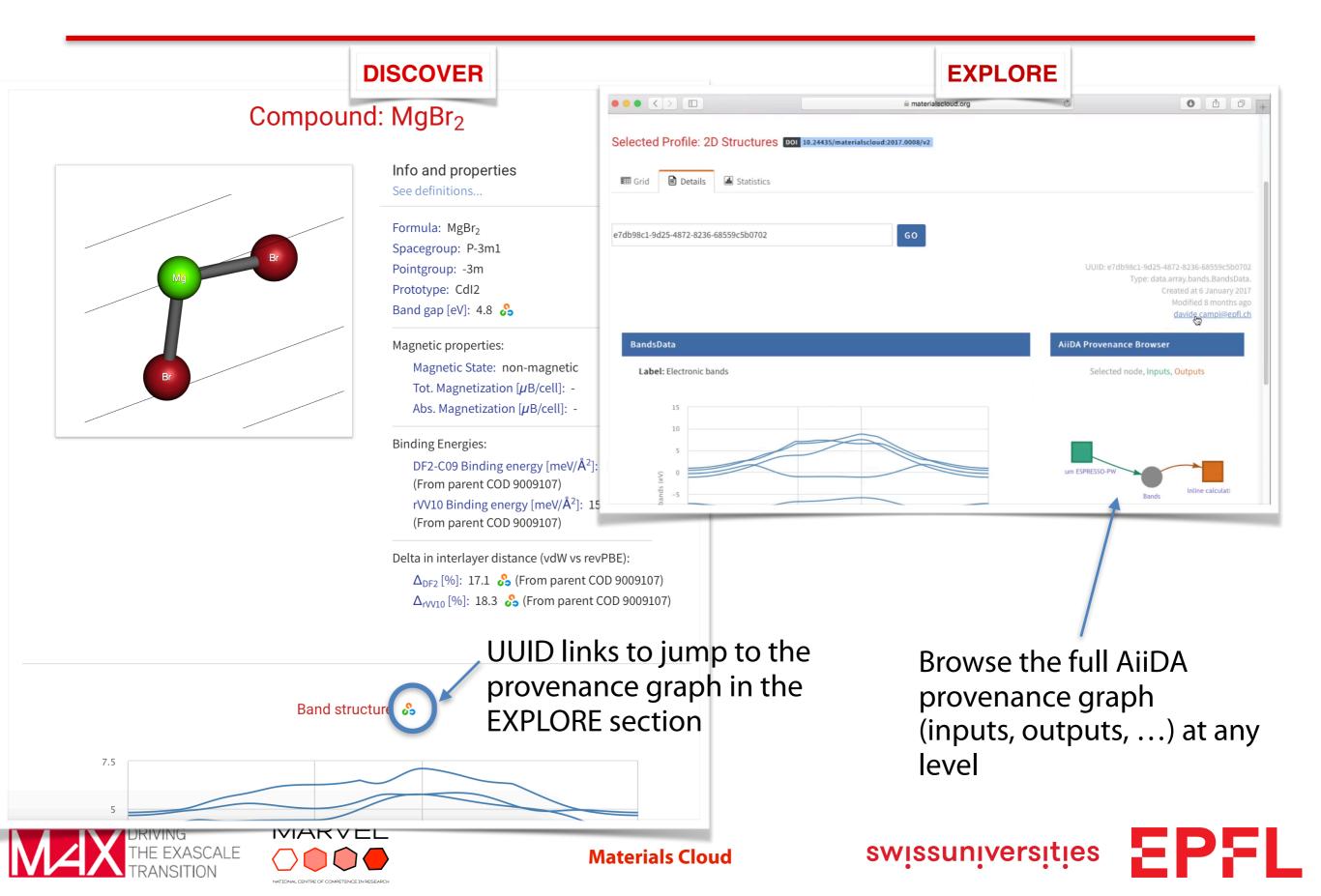












### DATA MANAGEMENT PLANS AND FAIR

- Combination of **AiiDA** + **Materials Cloud** (Discover, Explore, Archive): **FAIR-compliant sharing**
- Findable: DOIs with standardized metadata
- Accessible: web interface to browse data, calculations and provenance, curated data in Discover section

- Interoperable: data linked via the AiiDA directed graph; data structures reusable between different codes
- Reusable: downloadable data, encourage open (CC) licences, reproduce in the AiiDA Lab thanks to full provenance



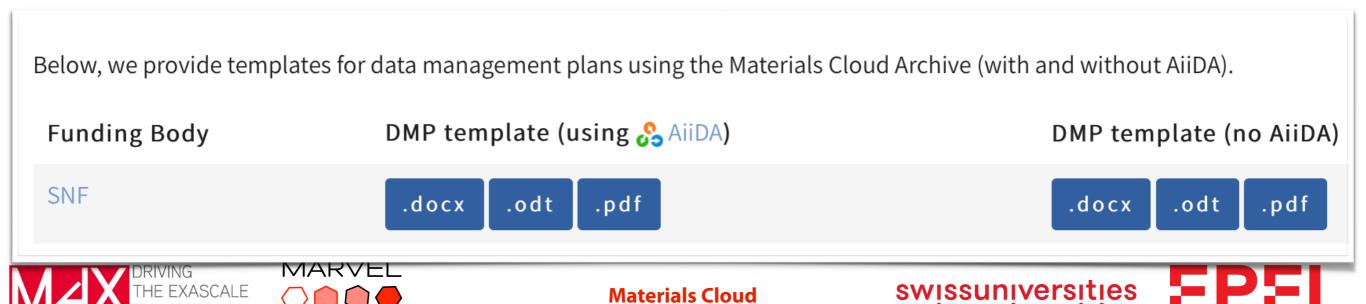


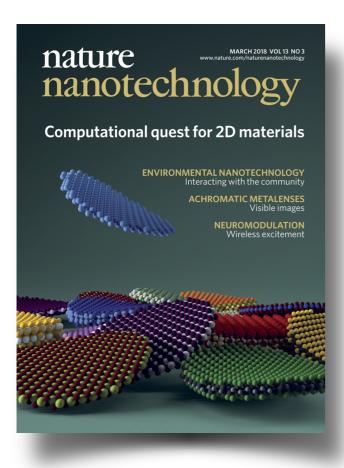


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- We provide DMP templates for researchers using Materials Cloud (and we are coordinating with EMMC for a EU H2020 template)



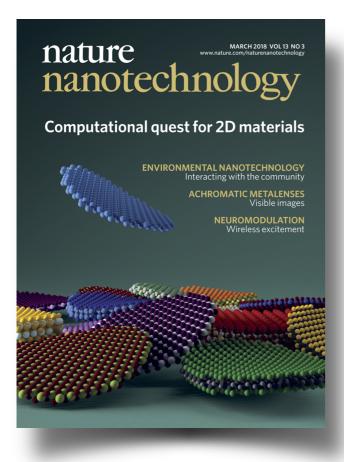


N. Mounet et al., Nature Nanotech. 13, 246 (2018)

### Data:

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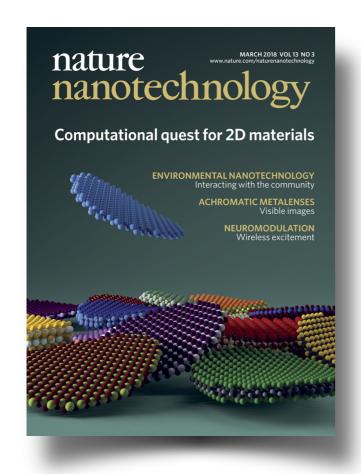
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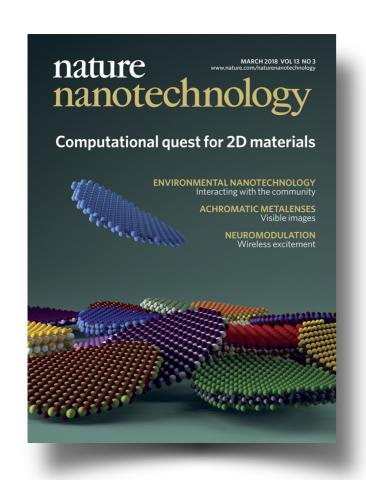
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Groups at CINECA and University of Bologna: develop a project using the published data, with a new unforeseen goal:

Prediction of the absolute time per iteration of a Quantum ESPRESSO run

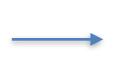




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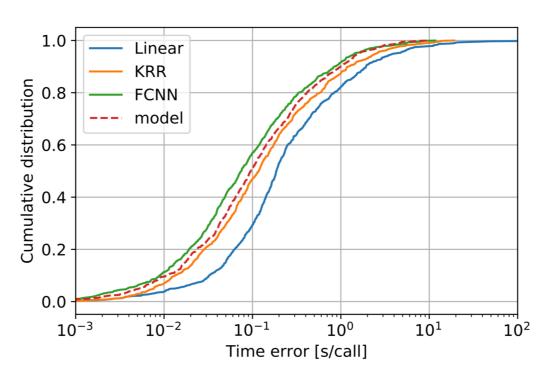
Prediction of the absolute time per iteration of a Quantum ESPRESSO run

"Prediction of time-to-solution in material science simulations using

**Deep Learning**"

(accepted to PASC19)

Need very detailed information on calculations, metadata, and machines ("identikeep")





# **ARCHIVE - FAQ**

Q: How much data can I upload per record?

A: Everyone: 5GB regular, 50GB AiiDA.

MARVEL & partners: for larger data sets just contact us

Q: How long will it be stored?

A: At least 10 years after submission.

Q: Can I update my record?

A: Yes, but only references & keyword (otherwise: new version)

Q: How to make a new version?

A: Edit existing submission & request publication again

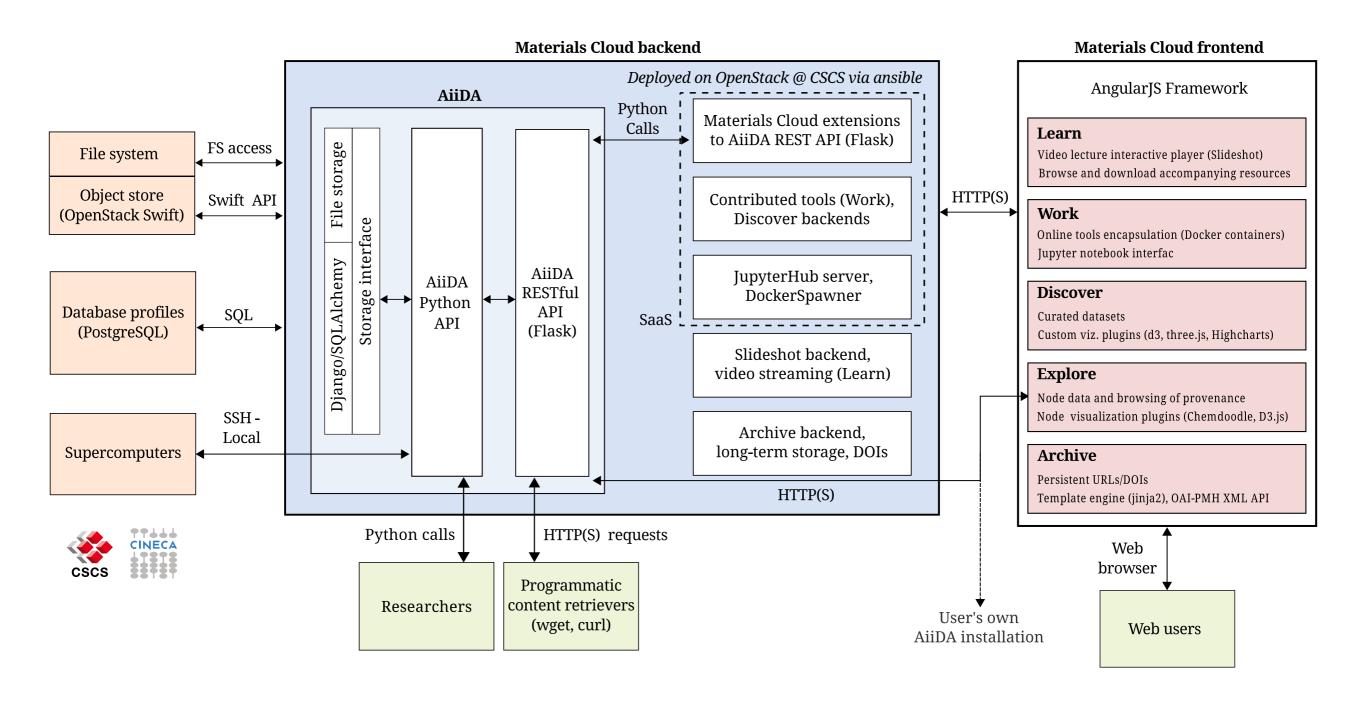
Q: Can I reserve a DOI before publication?

A: Not at the moment - we're working on it.

materialscloud.org/policies



### THE ENTIRE PLATFORM

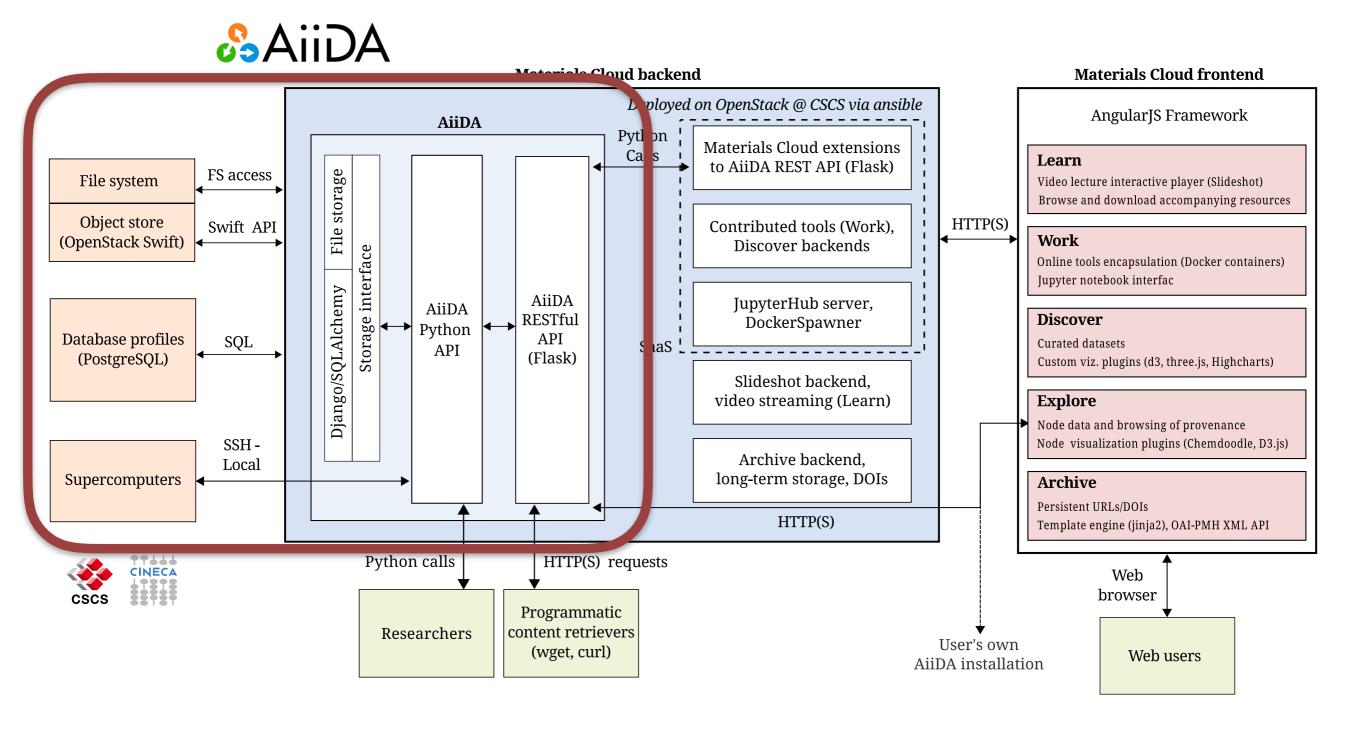








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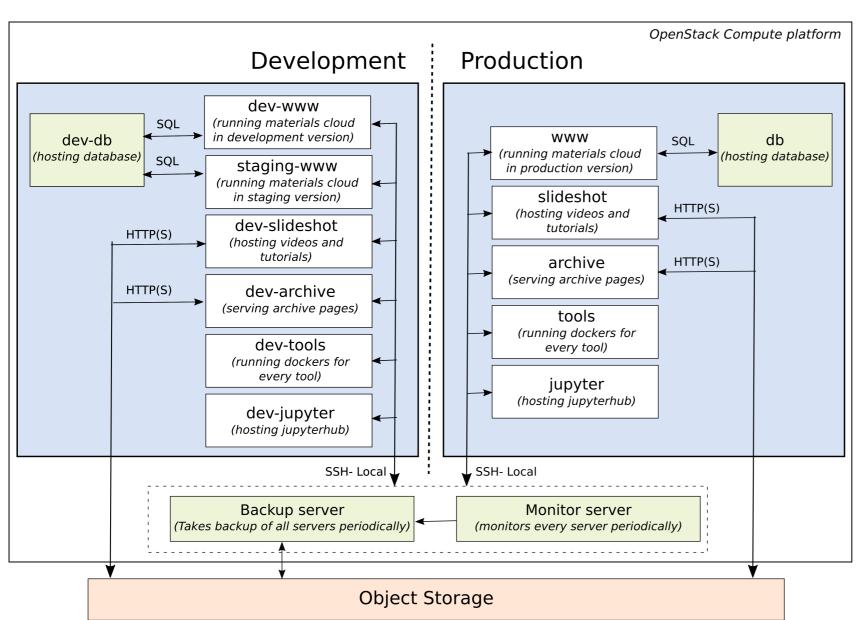








### PLATFORM DEPLOYMENT



- Deployment on the OpenStack platform @ CSCS
- Managed with ansible
- 6 production VMs + monitor&backup servers
- Environment duplicated for development, ensuring stability
- Data stored on the object storage (Swift) and on the DB machines







# Future plans

- Transition ARCHIVE to invenio 3
  - well-tested open-source software framework
  - scales up to millions of records (e.g. <u>zenodo.org</u>)
  - provides user management, search, serialization, ...
- Scalable AiiDA lab
  - Using kubernetes, supporting 100+ users
  - Connected to existing authentication services
- Deploy AiiDA lab elsewhere
  - Companies and universities
  - Contact us if you want AiiDA lab in your institution!



# Funding

















- SNSF MARVEL NCCR (I: 2014-18, II:2018-22, EPFL Lead house) for the Open Science Platform
- H2020 MaX Centre of Excellence (I: 2015-18, II: 2018-21)
   for convergence of HPC, HTC and HPDA via AiiDA
- H2020 MarketPlace (2018-22, EPFL co-PI) for providing materials simulation services and data
- H2020 Intersect (2019-21, EU; CNR lead PI, EPFL and ICN2 co-PI) for automated modelling of complex devices via AiiDA
- Private collaboration with a major European company (2019-2020)
   for AiiDA-powered materials discovery for Li-ion batteries
- Swissuniversities P-5 Materials Cloud (2019-20)
   for transitioning Materials Cloud to self-sustaining service
- EPFL Open Science Fund "OSSCAR" (2019-21) for creating an educational hub for research and teaching