



# Sharing & reusing molecular dynamics data: what did we miss?

#### Pierre Poulain

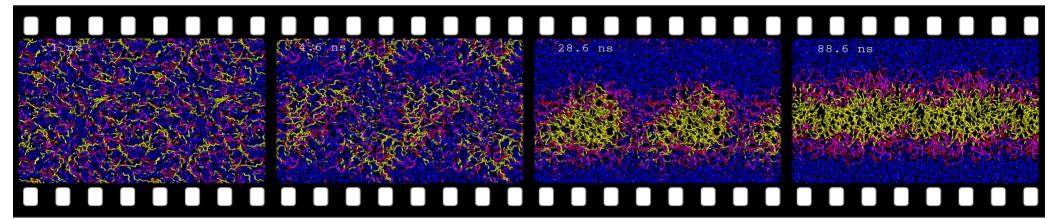
pierre.poulain@u-paris.fr

Laboratoire de Biochimie Théorique, Université Paris Cité

Open Science Days @UGA, Grenoble, 2024

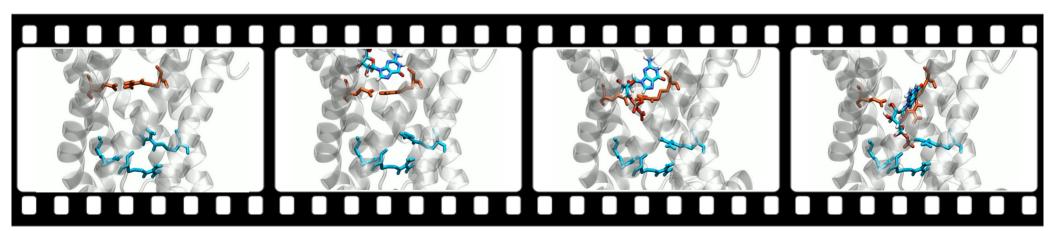


#### What is molecular dynamics (MD)?



water + detergent

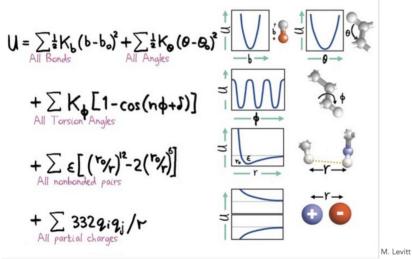
Senac et al, Langmuir, 2017. Movie by Patrick Fuchs



Gagelin et al, Nature communications, 2023.

# Molecular dynamics simulations require resources

#### expertise





#### computer power



Source ; Photothèque CNRS/Cyril Frésillon (droits réservés)

P. Poulain | CC E

# MD simulations require large computational resources → high cost



Source ; Photothèque CNRS/Cyril Frésillon (droits réservés)

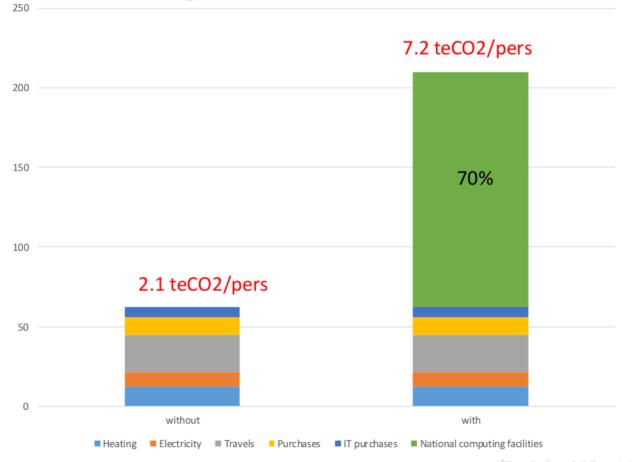


#### In 2023:

- GENCI, CT 7
   (simulation in biology)
- 160 Mh CPU
- 10 Mh GPU
- Total cost: 8.5 M€

Patrick Fuchs, 2024. 4/31

# MD simulations require large computational resources → high environmental cost



#### Sharing research data is important

- Requirements from funders, institutions, or journals
- Open science
- Reproducibility

Editorial Open access | Published: 21 February 2020

No raw data, no science: another possible source of the reproducibility crisis

<u>Tsuyoshi Miyakawa</u> ⊠

Molecular Brain 13, Article number: 24 (2020) Cite this article



Using Open Data to Rapidly Benchmark Biomolecular Simulations: Phospholipid Conformational Dynamics

Hanne S. Antila\*, Tiago M. Ferreira, O. H. Samuli Ollila, and Markus S. Miettinen\*

© Cite this: J. Chem. Inf. Model. 2021, 61, 2, 938-949
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#### Sharing research data in biology



Community-approved data repositories for experimental (omics) data:

- SRA, GEO, ENA: genomics & transcriptomics
- PRIDE, MassIVE: proteomics & metabolomics

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## **Sharing MD simulation files**



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#### **Sharing MD simulation files**



Many initiatives: MoDEL, GPCRmd, NMRLipids...

 No consensus data repository for MD simulation files (yet)

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#### **Sharing MD simulation files**



Many initiatives: MoDEL, GPCRmd, NMRLipids...

 No consensus data repository for MD simulation files (yet)

• Use of generic **non-moderated** data repositories: Zenodo, Figshare, OSF, Dryad...

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#### Welcome to the Dark Matter of MD

Data that is **technically accessible**,

but neither indexed, curated,

or easily **searchable**.





RESEARCH ARTICL





#### MDverse, shedding light on the dark matter of molecular dynamics simulations

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Competing interest: See page

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Abstract The rise of open science and the absence of a global dedicated data repository for molecular dynamics (MD) simulations has led to the accumulation of MD files in generalist data repositories, constituting the dark matter of MD — data that is technically accessible, but neither indexed, curated, or easily searchable. Leveraging an original search strategy, we found and indexed about 250,000 files and 2000 datasets from Zenodo, Fighare and Open Science Framework. With a focus on files produced by the Gromacs MD software, we illustrate the potential offered by the mining of publicly available MD data. We identified systems with specific molecular composition and were able to characterize essential parameters of MD simulation such as temperature and simulation length, and could identify model resolution, such as all-attom and course-grain. Based on this analysis, we inferred metadata to propose a search engine prototype to explore the MD data. To continue in this direction, we call on the community to pursue the effort of sharing MD data, and to report and standardize metadata to revse this valuable matter.

#### eLife assessment

The study presents a **valuable** tool for searching molecular dynamics simulation data, making such datasets accessible for open science. The authors provide **convincing** evidence that it is possible to identify noteworthy molecular dynamics simulation datasets and that their analysis can produce information of value to the community.

#### Introduction

The volume of data available in biology has increased tremendously (Marx, 2013; Stephens et al., 2015), through the emergence of high-throughput experimental technologies, often referred to as -omics, and the development of efficient computational techniques, associated with high-performance computing resources. The Open Access (OA) movement to make research results free and available to anyone (including e.g. the Budapest Open Access Initiative and the Berin declaration on Open Access to Knowledge) has led to an explosive growth of research data made available by scientists (Wilson

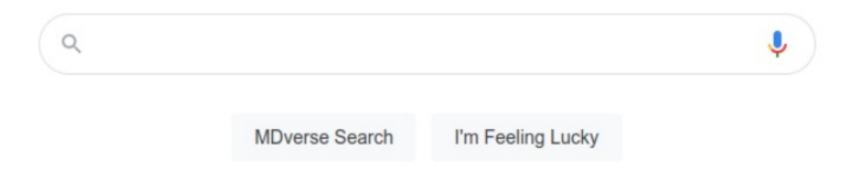
Tiemann et al. eLife 2023;12:RP90061. DOI: https://doi.org/10.7554/eLife.90061

1 of 22

DOI 10.7554/eLife.90061.3

#### A universal search engine for MD open data



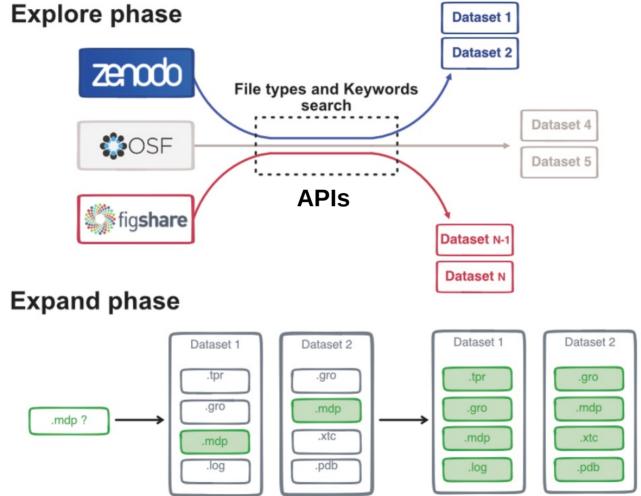


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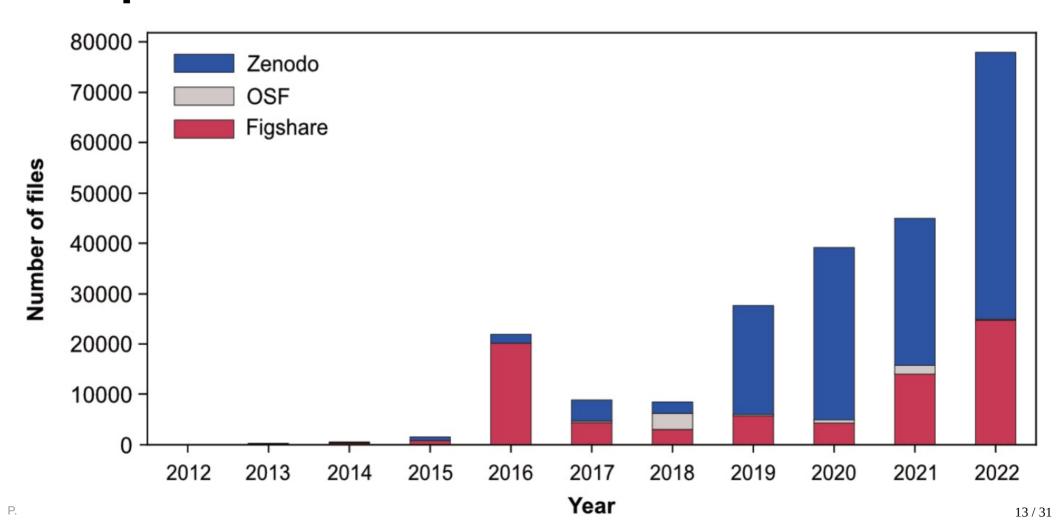
#### **MDverse**

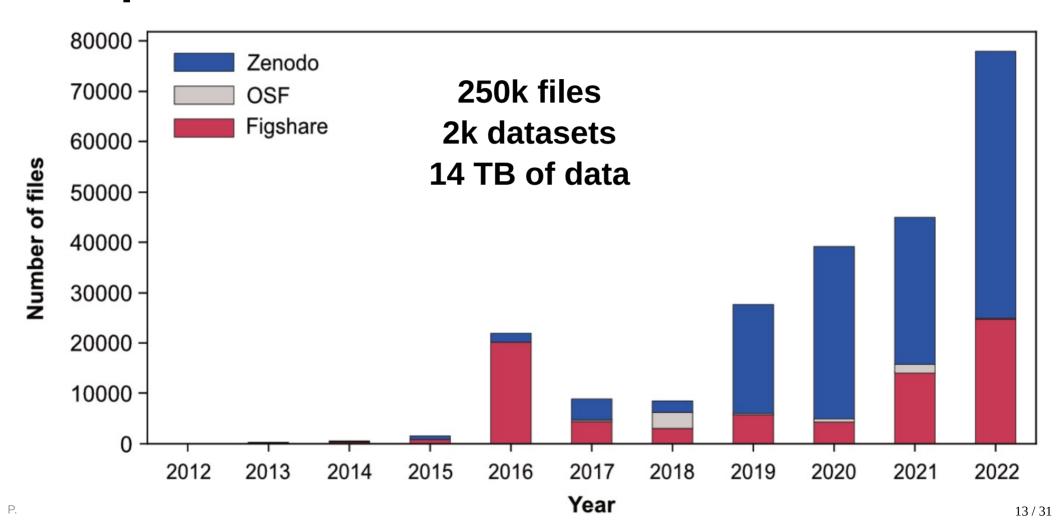
- 1. Find and index scattered MD data
- 2. Extract, enhance and explore metadata
- 3. Assess **accessibility** and **reusability** (from FAIR principles)

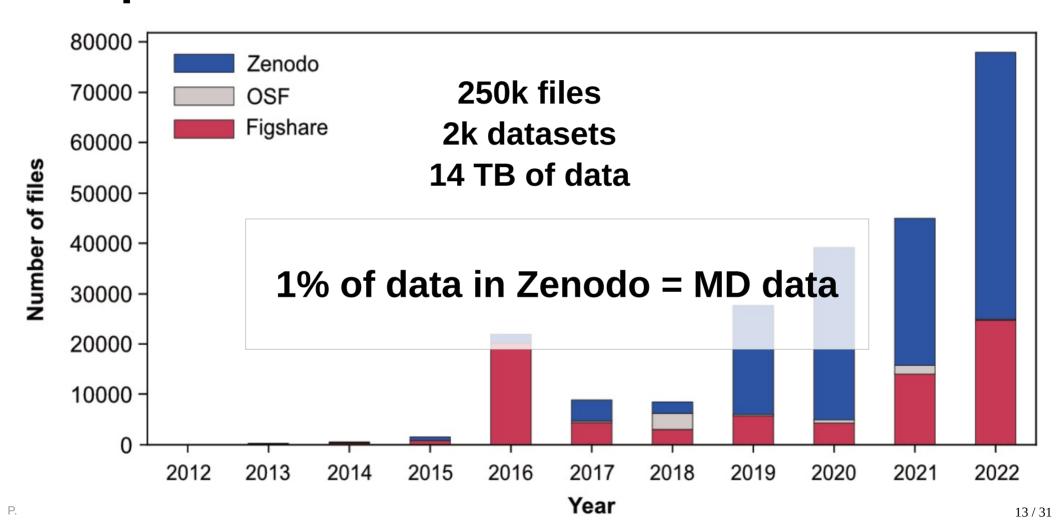
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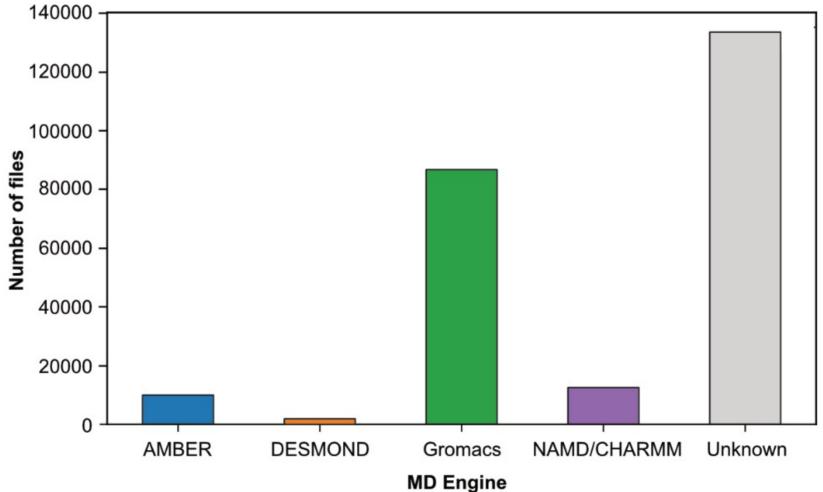


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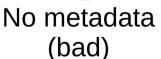
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#### **Step 2: Metadata = context**

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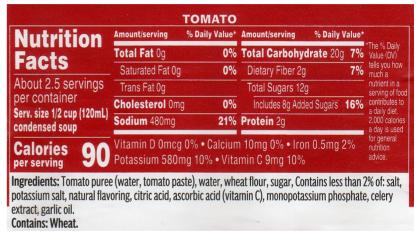






Natural language metadata (good)





Controlled vocabulary metadata (better)



#### **Step 2: Metadata = context**

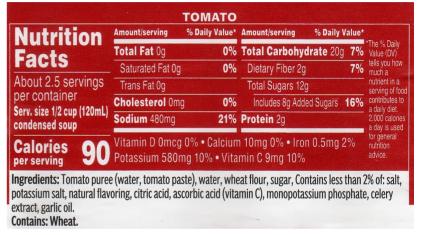


(bad)



Natural language metadata (good)





Controlled vocabulary metadata (better)



Metadata for MD simulation: identity of simulated molecules, temperature, length, force field, software...

#### **Step 2: Sources of MD metadata**

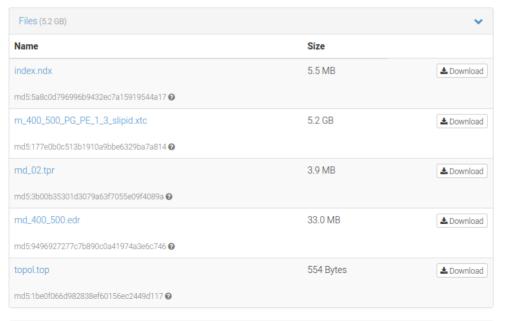
February 27, 2019 Journal article Open Access

# SLIPID POPG-POPE 1:3 Bilayer Simulation (Last 100 ns, 150 mM NaCl, 310 K)

#### PEÓN. Antonio

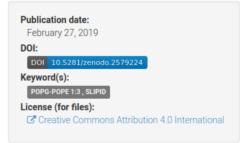
Simulation of a POPG-POPE 1:3 bilayer of 500 lipids (126 L-POPG lipids and 374 POPE lipids, 250 per leaflet) is simulated for 500 ns using Gromacs v5.1.2 in water solution with Na+ counterions and 150 mM of NaCl. The SLIPID model is employed for lipids and TIP3P Water Model.

Trajectory (.xtc) is for the last 100 ns of a simulation of 500 ns with data saved every 10 ps. Additionally, the topology (.top) , simulation parameter file (.mdp), index file (.ndx), portable binary run input file (.tpr) and the energy output file (.edr) are provided.











#### Step 2: Sources of MD metadata

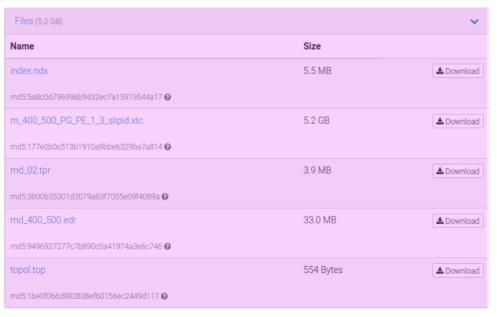
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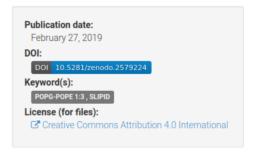
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#### Step 2: Sources of MD metadata



PEÓN, Antonio

February 27, 2019

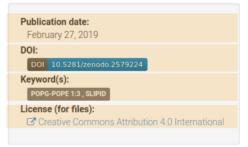
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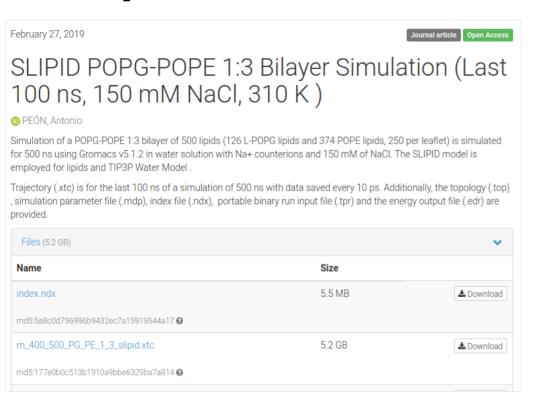








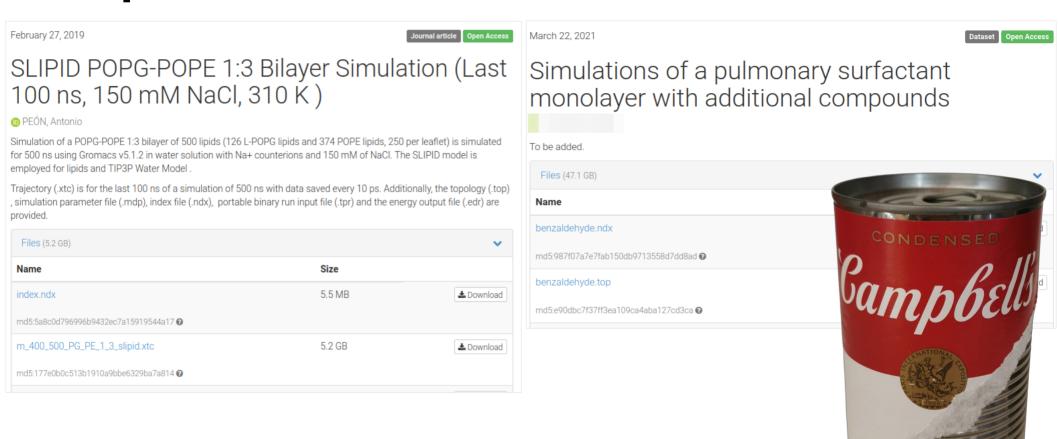




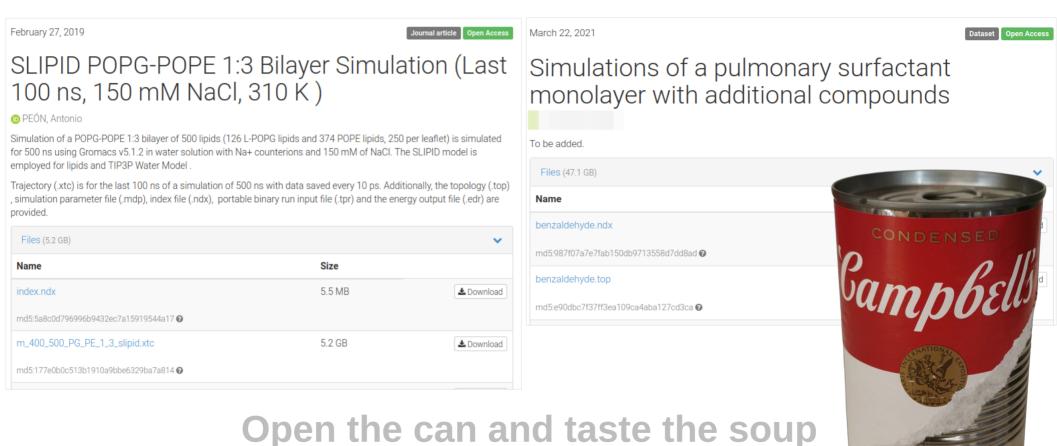
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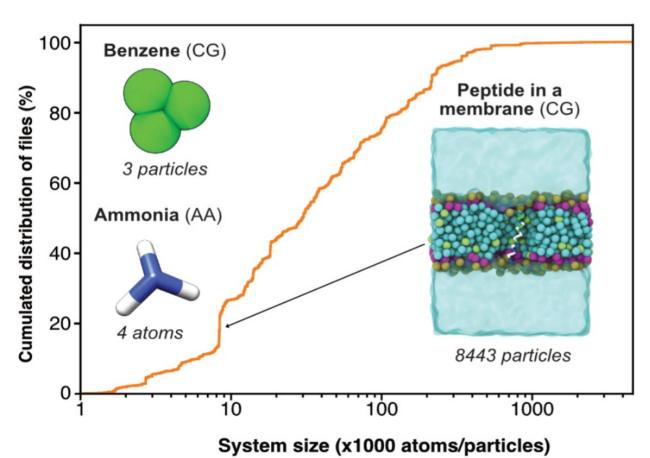
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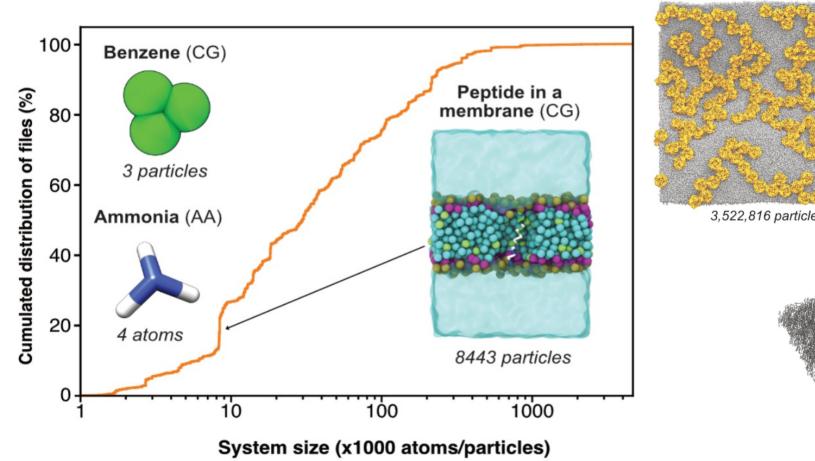
Open the file and extract metadata

## Step 2: Metadata from Gromacs (.gro) files

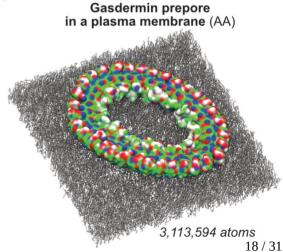


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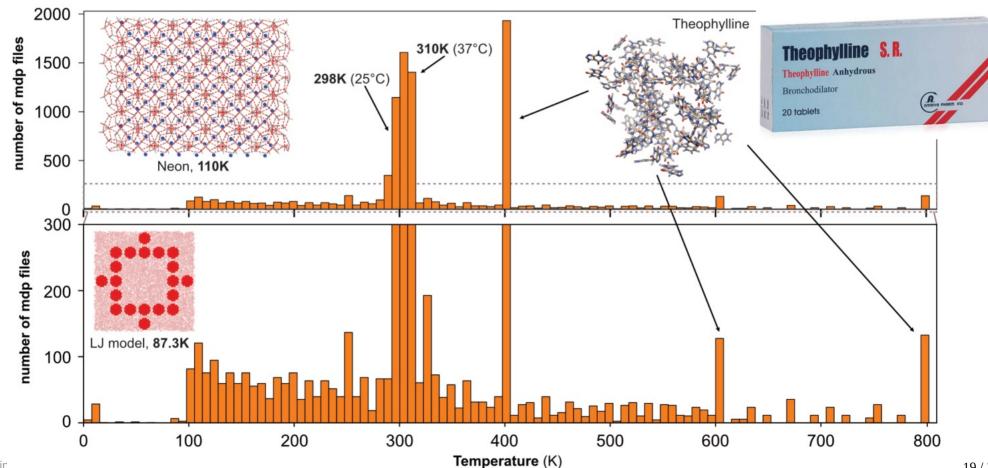
## Step 2: Metadata from Gromacs (.gro) files



Kir Channels in a plasma membrane (CG) 3,522,816 particles



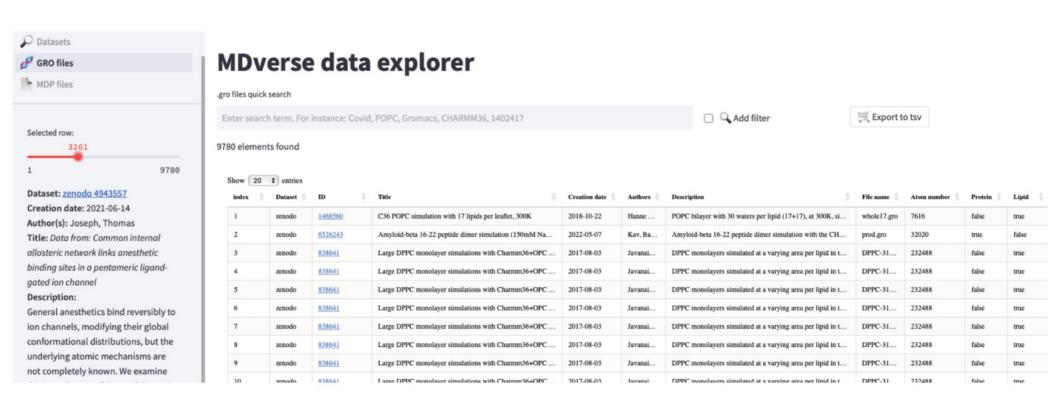
#### Step 2: Metadata from Gromacs (.mdp) files



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#### Step 2: Explore metadata





https://mdverse.streamlit.app/

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#### Step 3: Back to the FAIR principles

Findable
Accessible
Interoperable
Reusable

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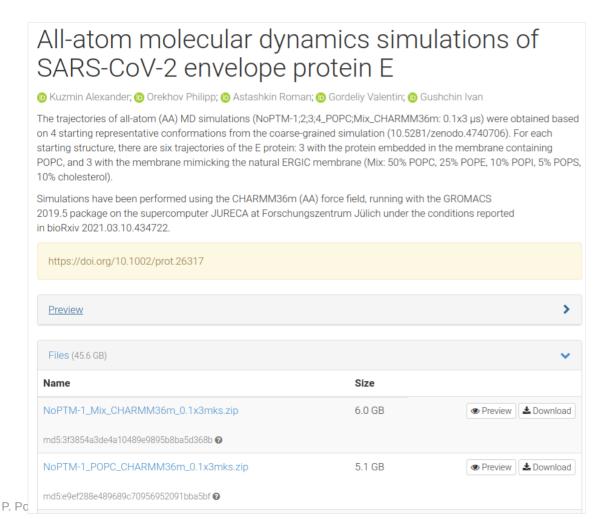
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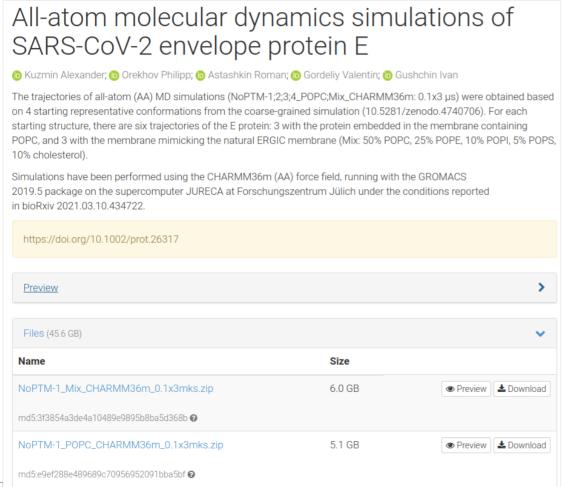
"[...] the FAIR Principles put specific emphasis on enhancing the ability of **machines to automatically** find and **use the data**, in addition to supporting its reuse by individuals."

Wilkinson et al., Scientific Data, 2016.

#### Step 3: Assess accessibility (zip files)



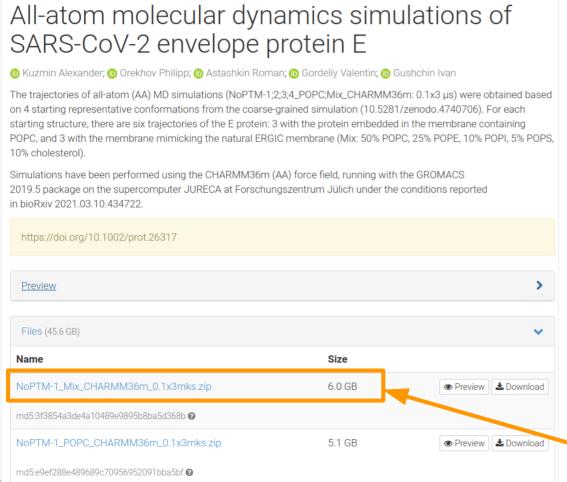
#### Step 3: Assess accessibility (zip files)



88 % of indexed files were in zip files

NoPTM-2-1_Mix_CHARMM36m_0.1mks.xtc 1.9 GB	NoPTM-2_Mix_CHARMM36m_0.1x3mks.zip	
☐ NoPTM-2-2_Mix_CHARMM36m_0.1mks.xtc 1.9 GB ☐ NoPTM-2-3_Mix_CHARMM36m_0.1mks.xtc 1.9 GB ☐ NoPTM-2_Mix_CHARMM36m.pdb 11.8 MB ☐ NoPTM-2_Mix_CHARMM36m.tpr 4.1 MB	NoPTM-2-2_Mix_CHARMM36m_0.1mks.xtc NoPTM-2-3_Mix_CHARMM36m_0.1mks.xtc NoPTM-2_Mix_CHARMM36m.pdb	1.9 GB 1.9 GB 11.8 MB

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NoPTM-2-2_Mix_CHARMM36m_0.1mks.xtc	1.9 GB
NoPTM-2-3_Mix_CHARMM36m_0.1mks.xtc	1.9 GB
NoPTM-2_Mix_CHARMM36m.pdb	11.8 MB
☐ NoPTM-2_Mix_CHARMM36m.tpr	4.1 MB

# Step 3: Assess reusability

A Gromacs trajectory file could be reused to:

- Analyze a simulation (.xtc + .pdb/.gro/.tpr)
- Continue a simulation (.gro/.trr/.cpt + .mdp/.tpr)

# Step 3: Assess reusability

A Gromacs trajectory file could be reused to:

- Analyze a simulation (.xtc + .pdb/.gro/.tpr)
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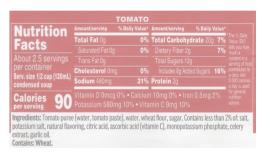
Do we have any proof we can actually reuse the data?

Depositing MD simulations data in a FAIR-enabled repository does **not guarantee** your data is actually FAIR

Depositing MD simulations data in a FAIR-enabled repository does **not guarantee** your data is actually FAIR

Provide metadata (context)

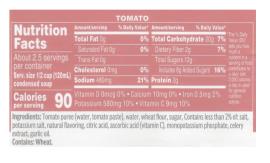




Depositing MD simulations data in a FAIR-enabled repository does **not guarantee** your data is actually FAIR

- Provide metadata (context)
- Avoid zip files (no .tgz)

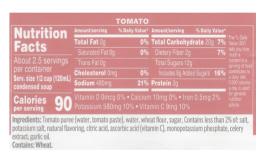




Depositing MD simulations data in a FAIR-enabled repository does **not guarantee** your data is actually FAIR

- Provide metadata (context)
- Avoid zip files (no .tgz)





## Why is it important?

- Sharing and storing data cost money and energy
- Dynamic generative deep-learning models?
   (Need for high quality, curated data)

# Keep digging!

P. Poulain | CC BY

# **Keep digging!**

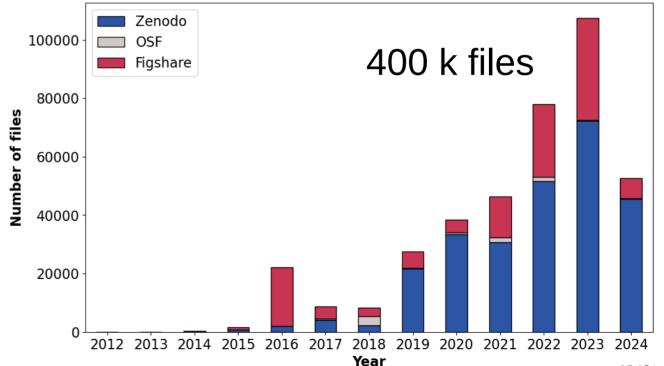
Explore other "data" repositories:

- Dryad, Science Data Bank
- ATLAS, MDDB

# **Keep digging!**

## Explore other "data" repositories:

- Dryad, Science Data Bank
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Extract structured metadata from raw text

#### Extract structured metadata from raw text

Published December 24, 2019 | Version v1





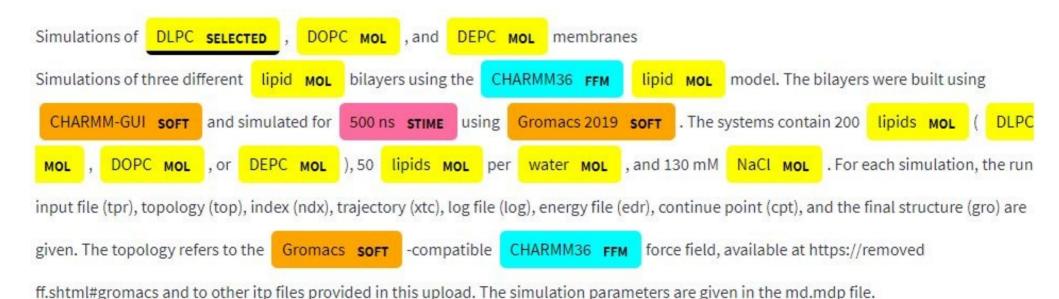
#### Simulations of DLPC, DOPC, and DEPC membranes

Matti Javanainen 1 🕞

Show affiliations

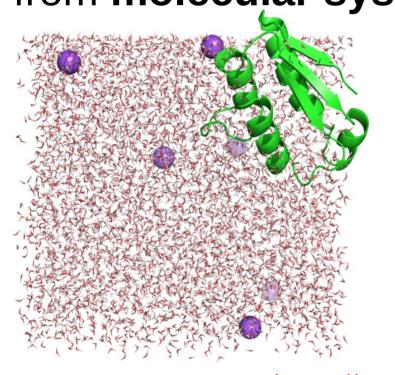
Simulations of three different lipid bilayers using the CHARMM36 lipid model. The bilayers were built using CHARMM-GUI and simulated for 500 ns using Gromacs 2019. The systems contain 200 lipids (DLPC, DOPC, or DEPC), 50 lipids per water, and 130 mM NaCl. For each simulation, the run input file (tpr), topology (top), index (ndx), trajectory (xtc), log file (log), energy file (edr), continue point (cpt), and the final structure (gro) are given. The topology refers to the Gromacs-compatible CHARMM36 force field, available at http://mackerell.umaryland.edu/charmm\_ff.shtml#gromacs and to other itp files provided in this upload. The simulation parameters are given in the md.mdp file.

# Extract structured metadata from raw text Text mining / Named Entity Recognition



Mohamed Oussaren

Extract structured metadata from molecular systems





X

Improve discoverability and data(sets) exploration



Linked User-driven Multidisciplinary Exploration Network 2025 → 2027

Involved communities: SSH, Maths, Earth System, Molecular Dynamics



IJM, Paris, France Lisa Bouarroudj Mohamed Oussaren

**CBI, Toulouse, France**Magdalena Szczuka *Matthieu Chavent* 

**LBT, Paris, France**Marc Baaden
Karine Duong

**Amsterdam, Netherlands** Steven Garcia **Univ. Copenhagen, Denmark** 

Johanna K. S. Tiemann Kresten Lindorff-Larsen

KTH Royal Inst. Tech. Stockholm, Sweden

Lucie Delemotte Erik Lindahl

Stockholm Univ., Sweden Rebecca J. Howard

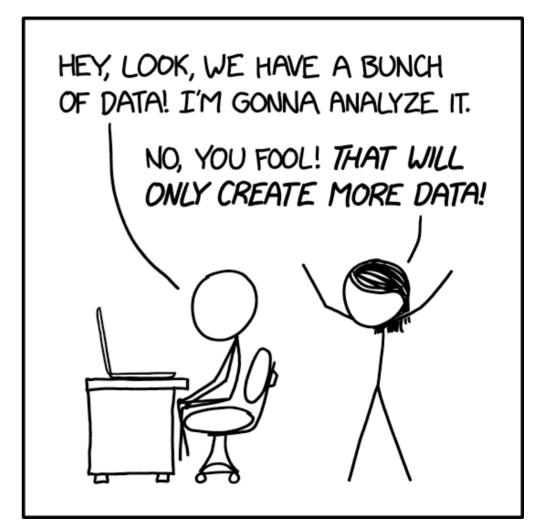
# Questions?





▲ This presentation ▲

DOI 10.5281/zenodo.14264571



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