



**Part I: "In-silico microscopy" methods for large-scale LAMMPS simulations**

**Part II: OVITO 3.0 - A powerful data analysis and visualization tool for LAMMPS users**

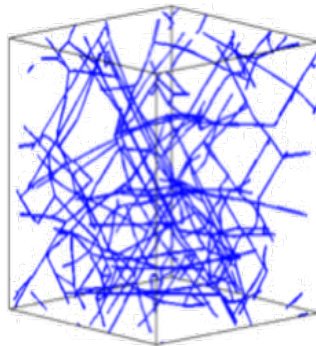
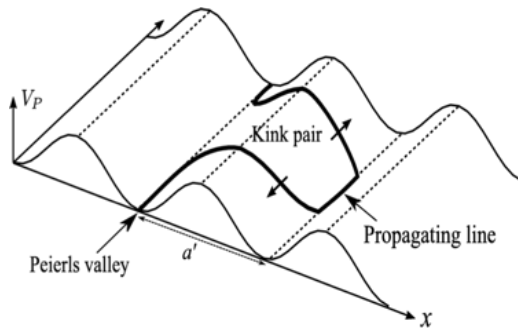
**Dr. Alexander Stukowski**

Darmstadt University of Technology, Germany  
Materials and Earth Sciences

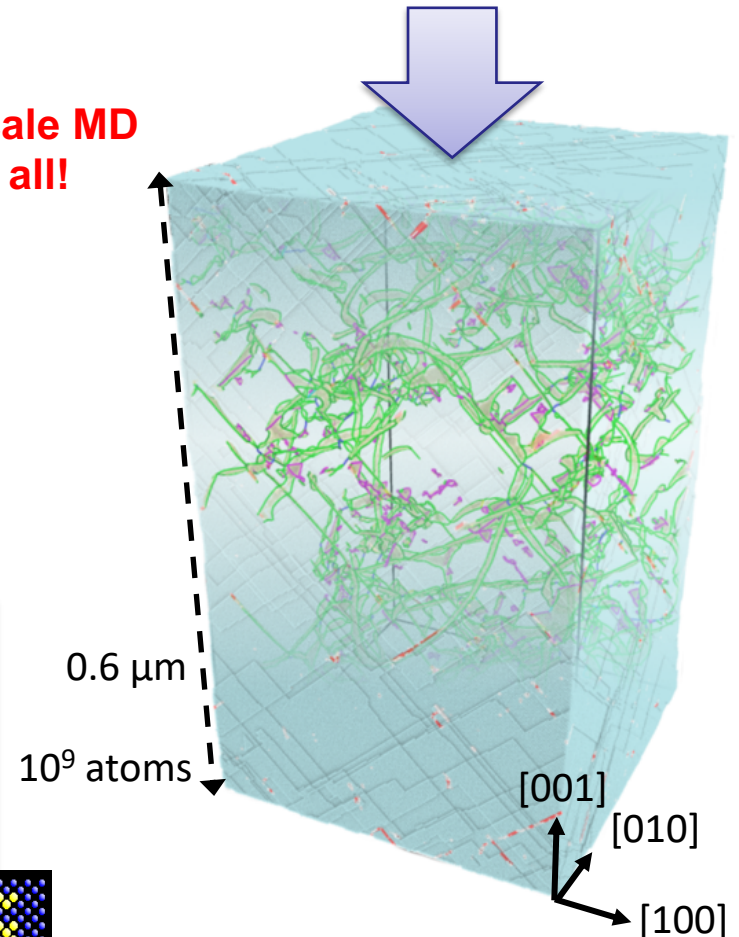
# Studying crystal plasticity with MD

## Dislocations: a multi-scale modelling problem

- Long-range interactions, collective behavior
  - “Core effects” on the atomic scale
- } **Large-scale MD includes all!**



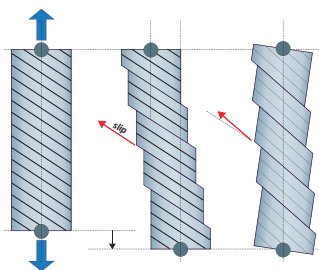
Zepeda-Ruiz et al., *Nature* 550 (2017), 492



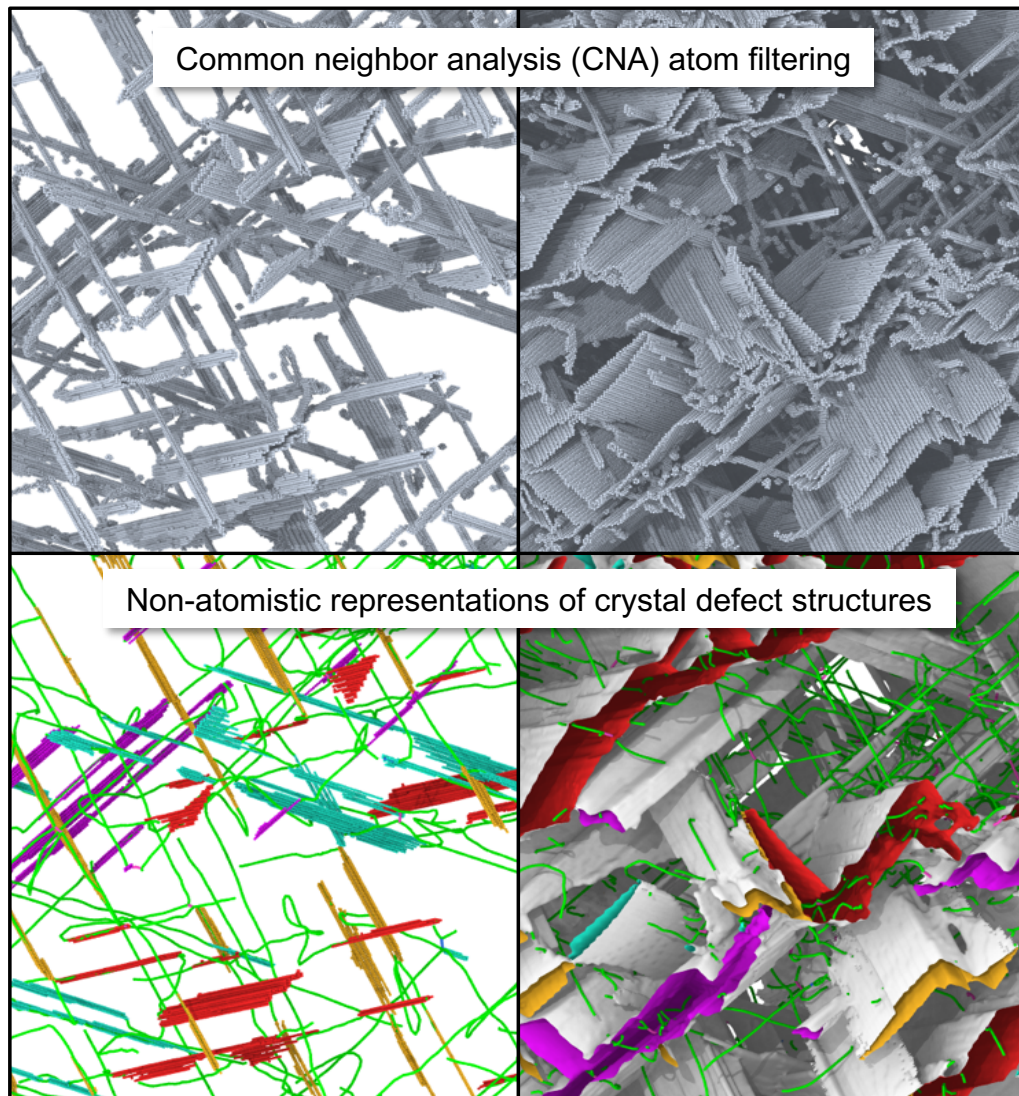


# Our analysis needs

- Detection and visualization of crystal twinning
- Tracking crystal rotation
- Identifying dislocation lines / measuring defect densities
- Tracking dislocation motion

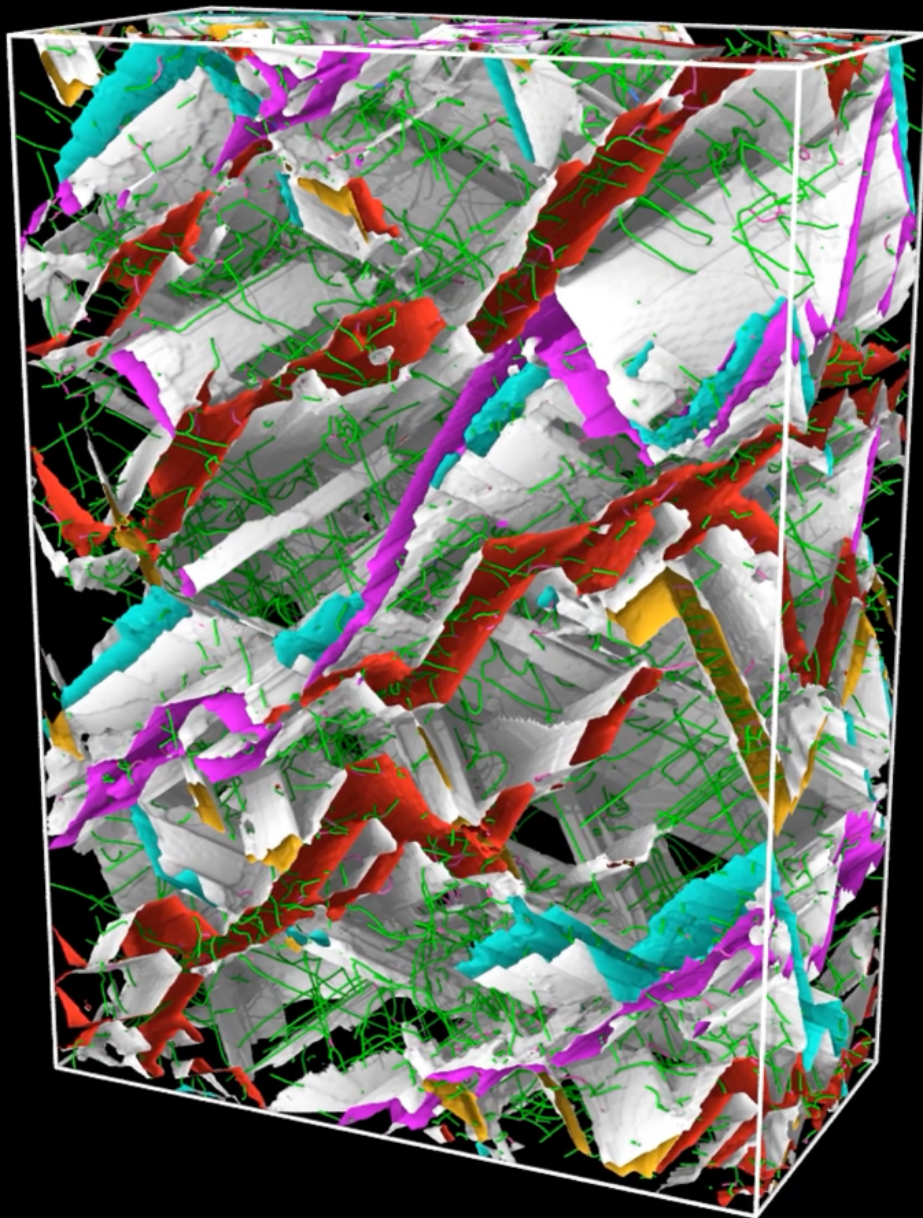


Ideally do these on the fly!



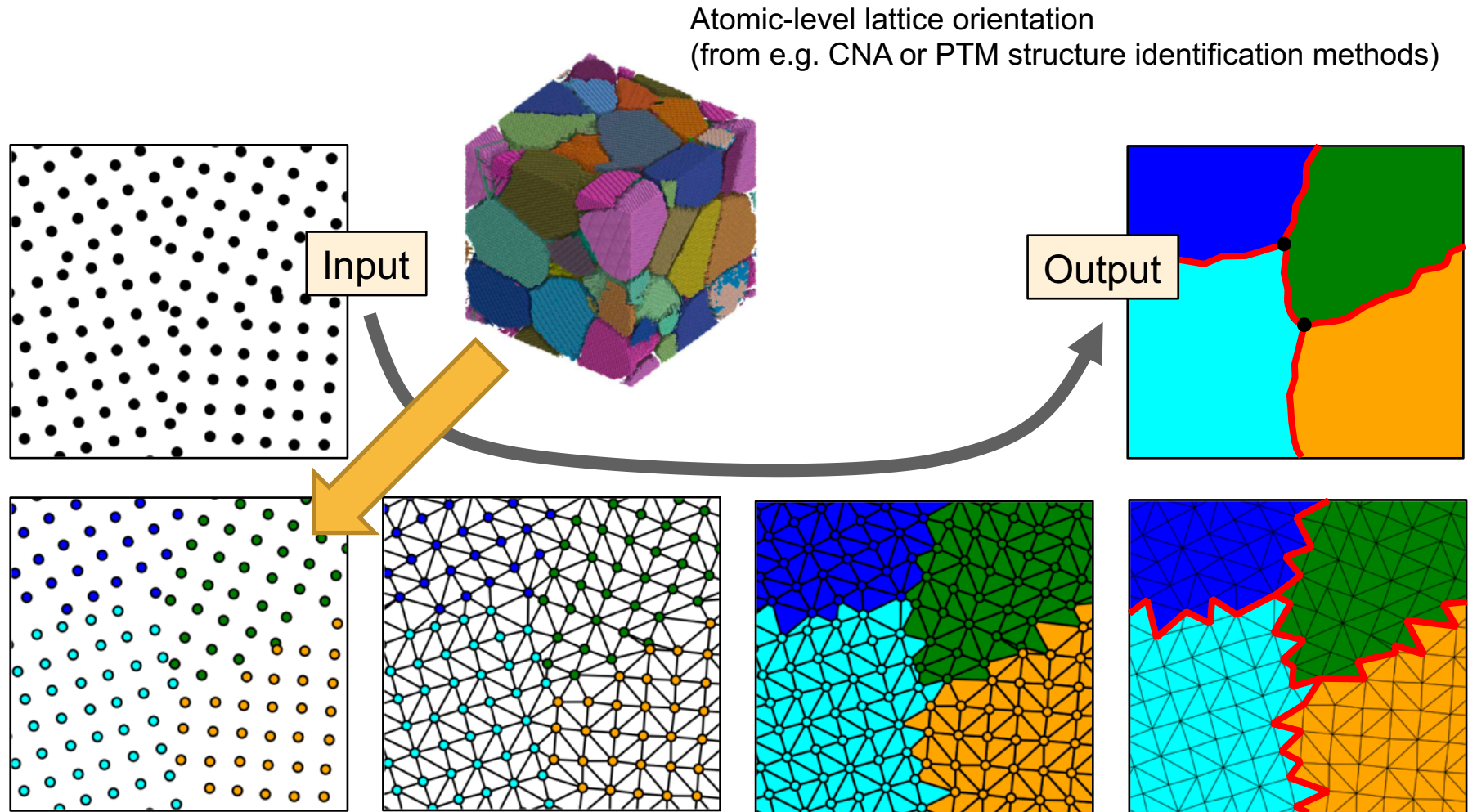
**MD simulation of Ta crystal  
being strained at a  
supercritical rate**

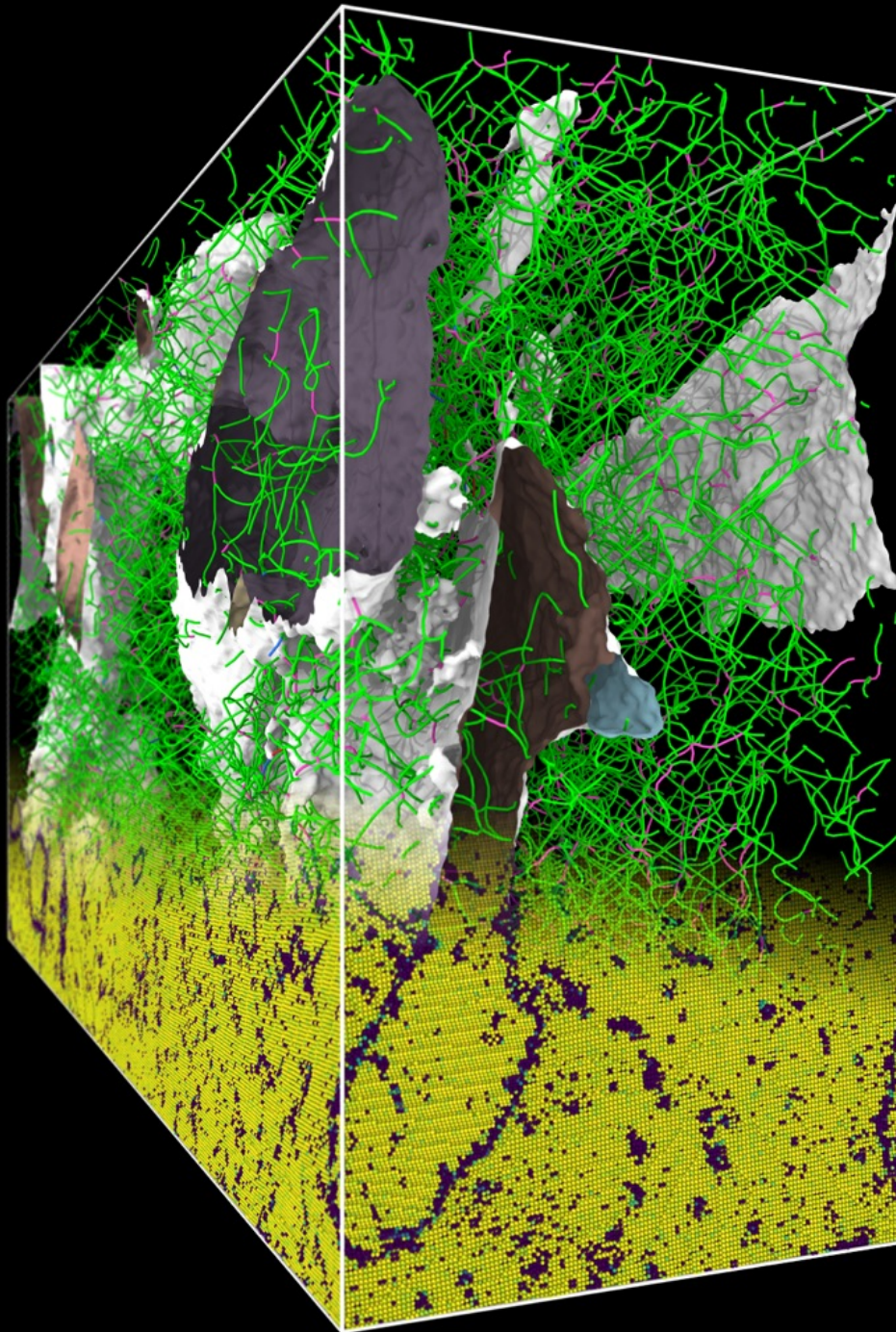
**~33M atoms**





# Grain segmentation algorithm

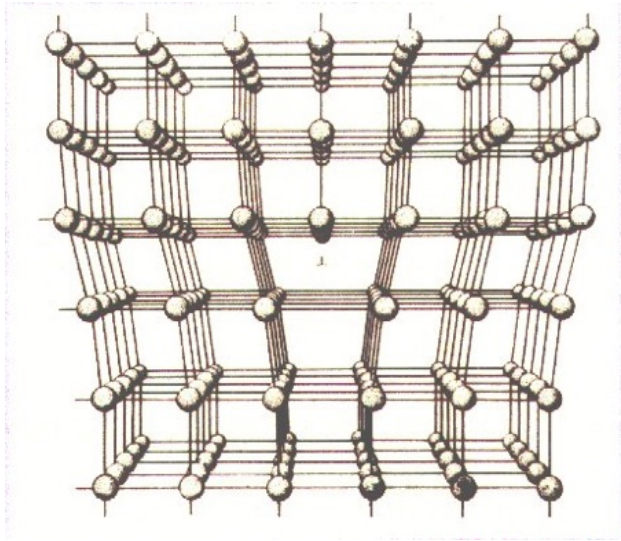






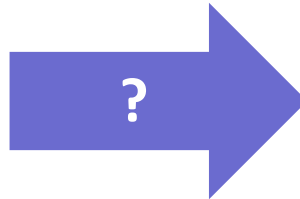
# Dislocation defects

## Atomistic picture of dislocations

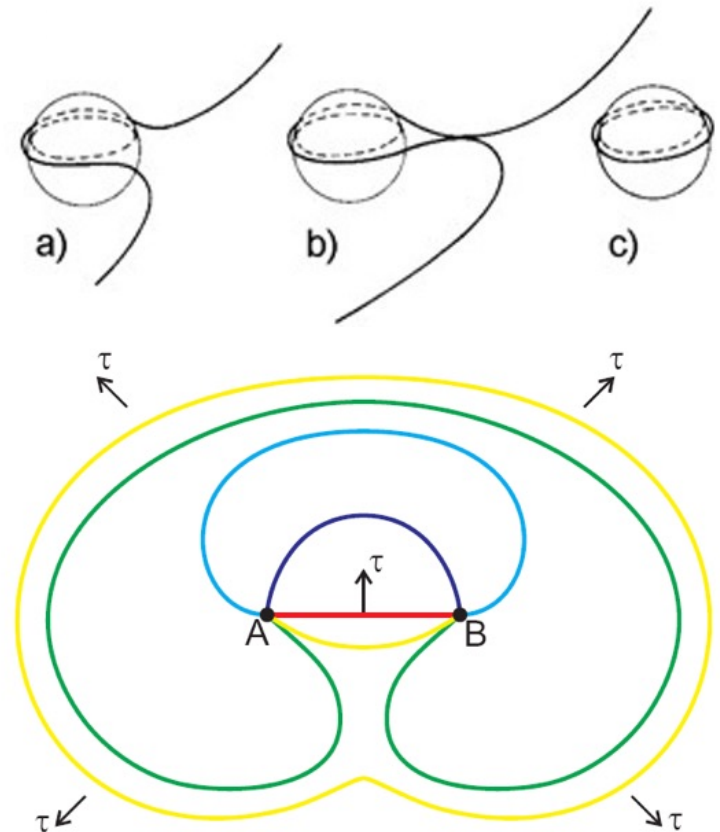


How to measure  
dislocation content in  
MD simulations?

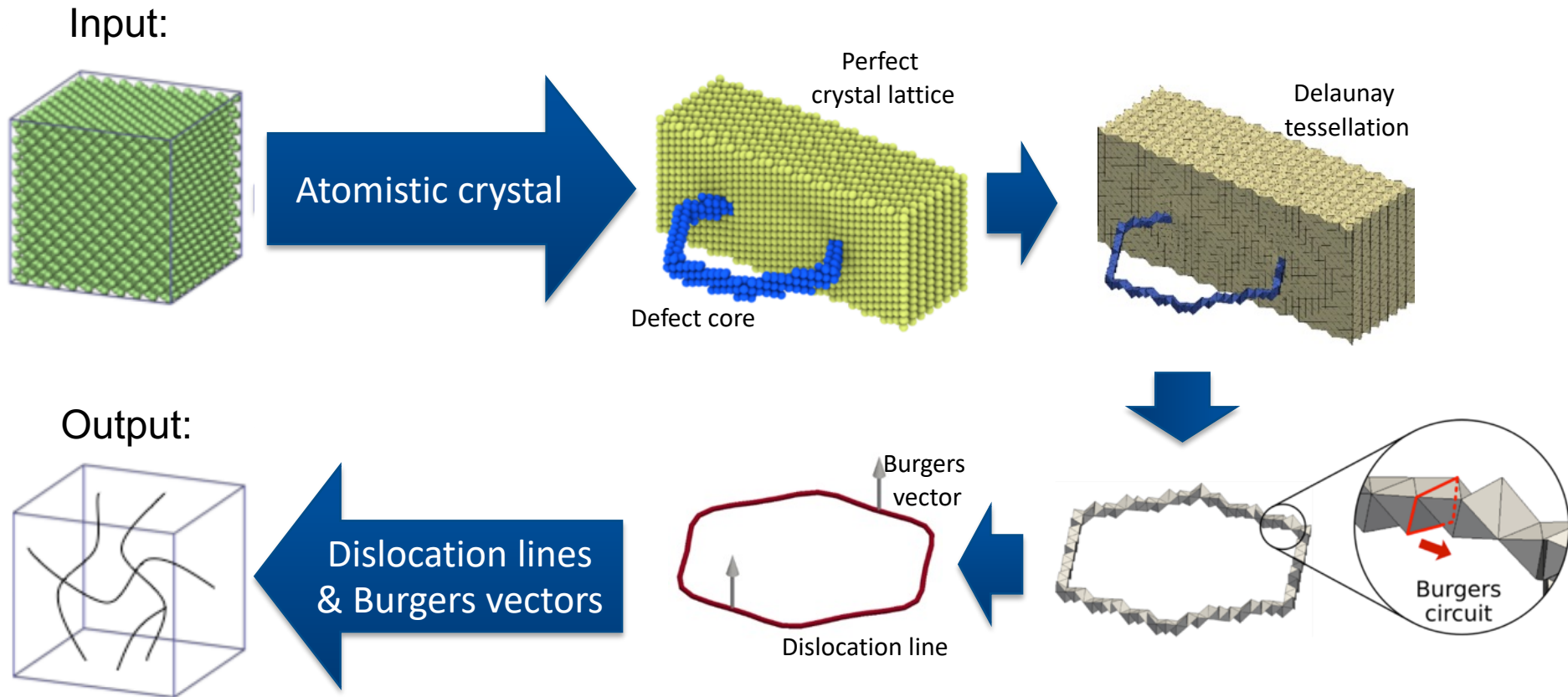
$$\rho = \frac{1}{V} \int dl$$



## Discrete dislocation line theory

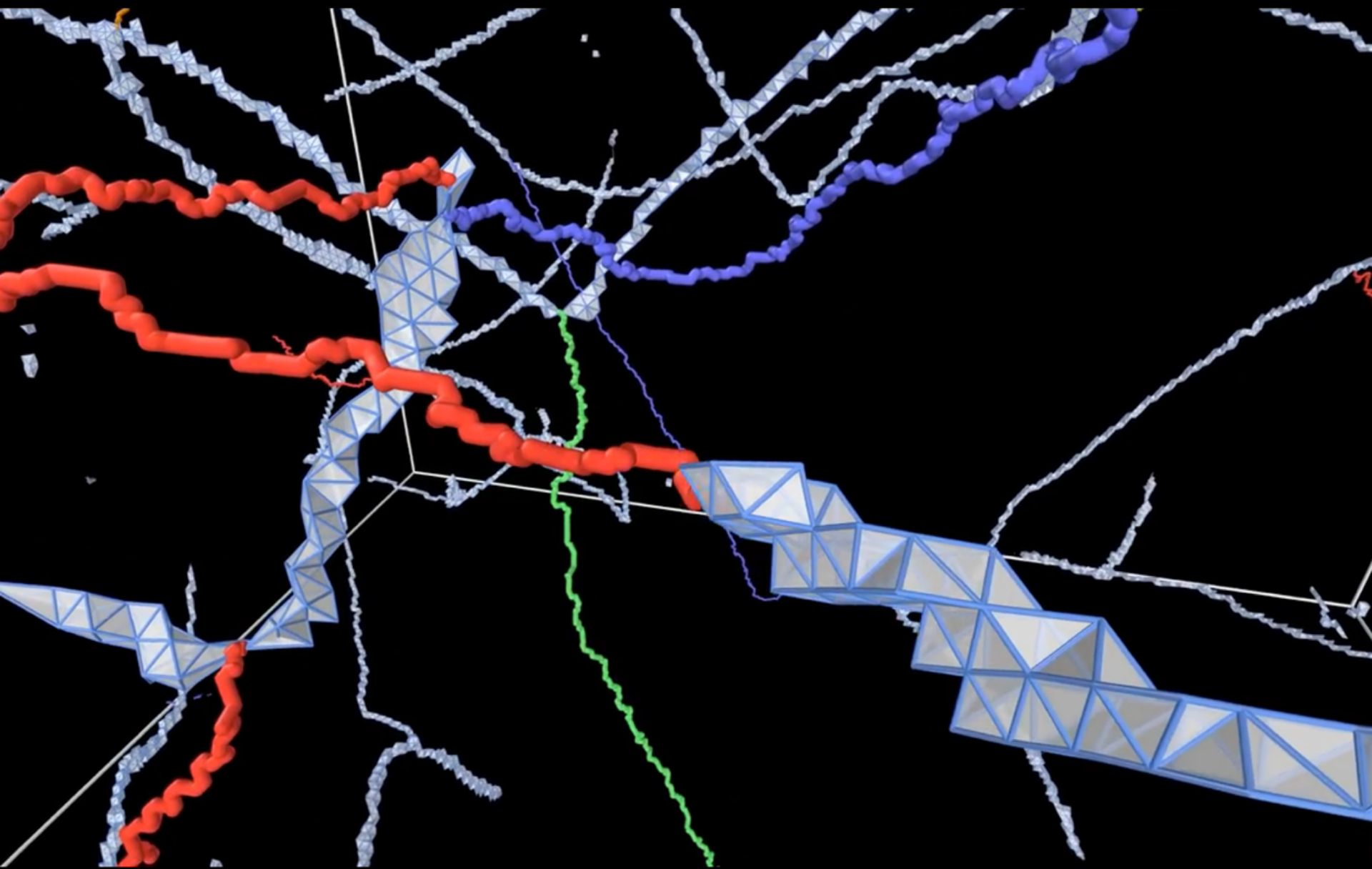


# Dislocation Extraction Algorithm (DXA) in OVITO



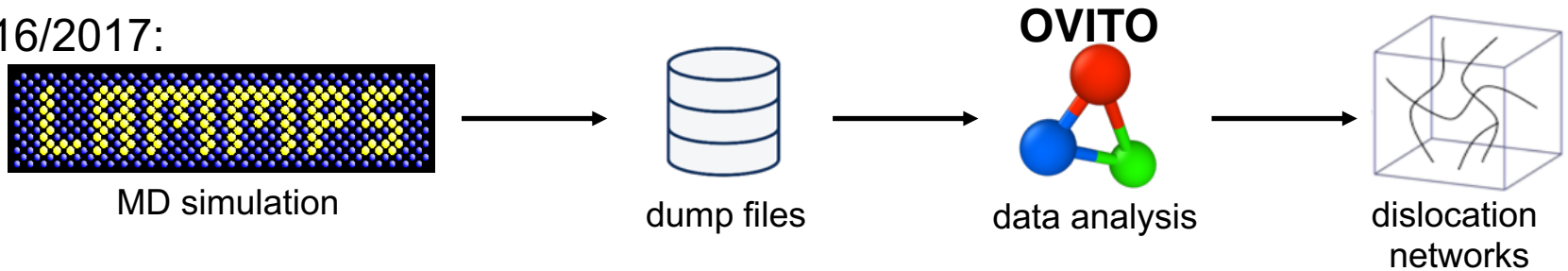
2012 Stukowski et al. MSMSE 20, 085007



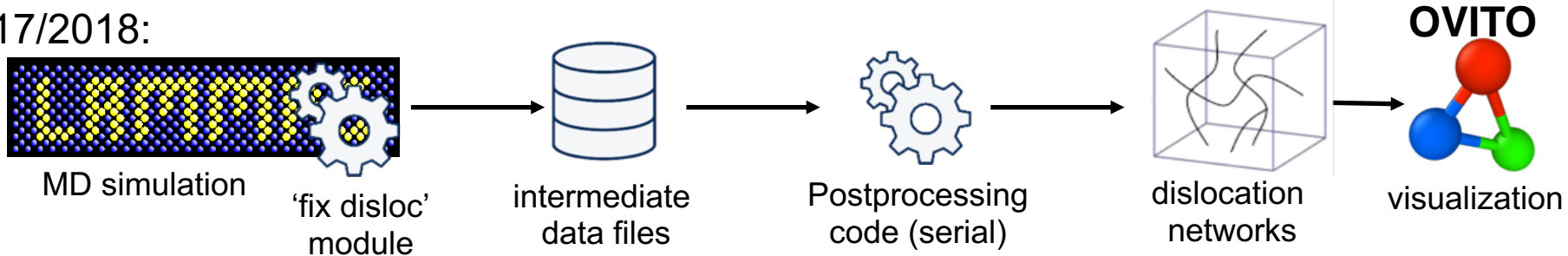


# Data analysis workflows

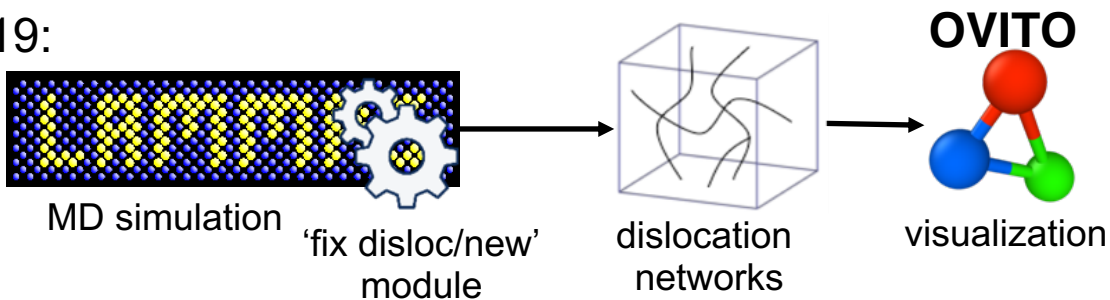
2016/2017:



2017/2018:



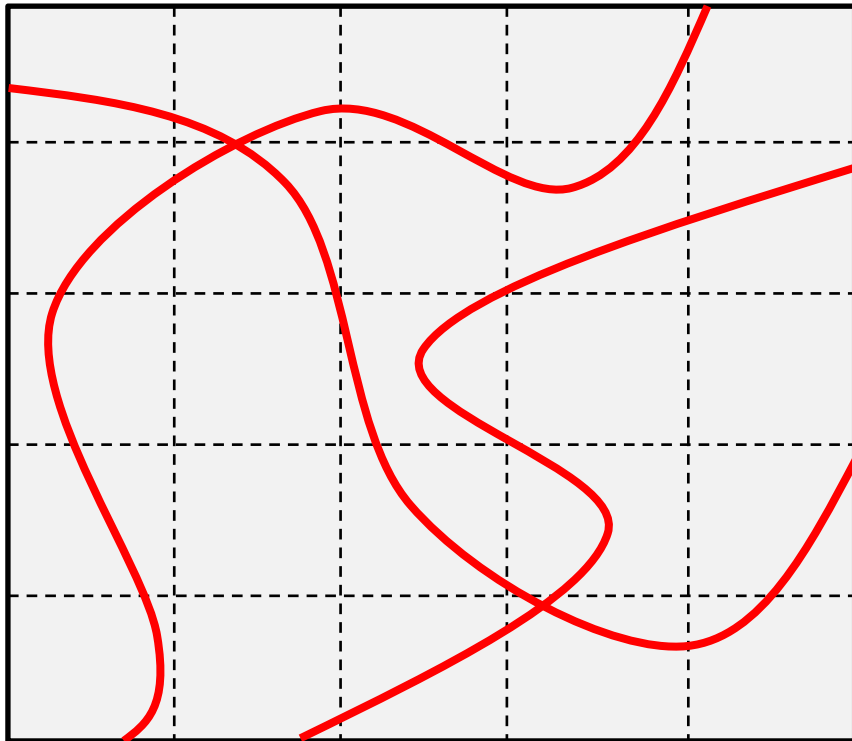
2019:



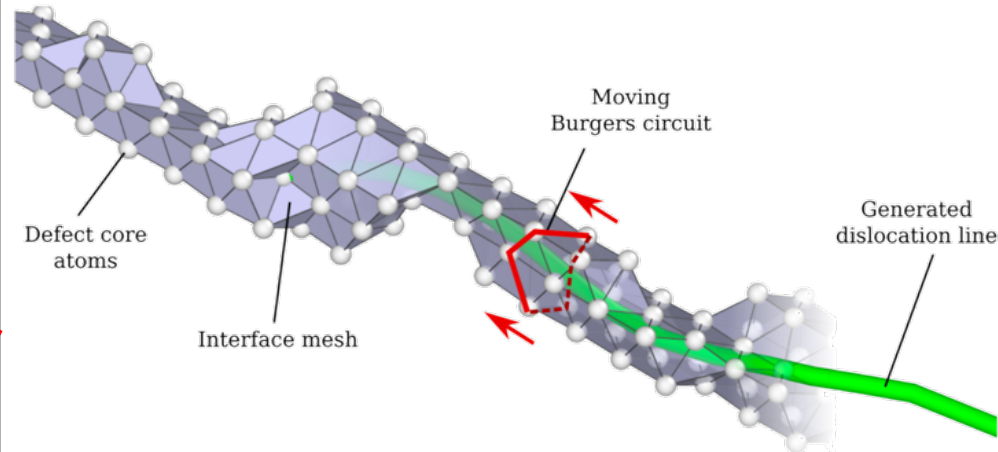


# How to parallelize the identification of extended structures?

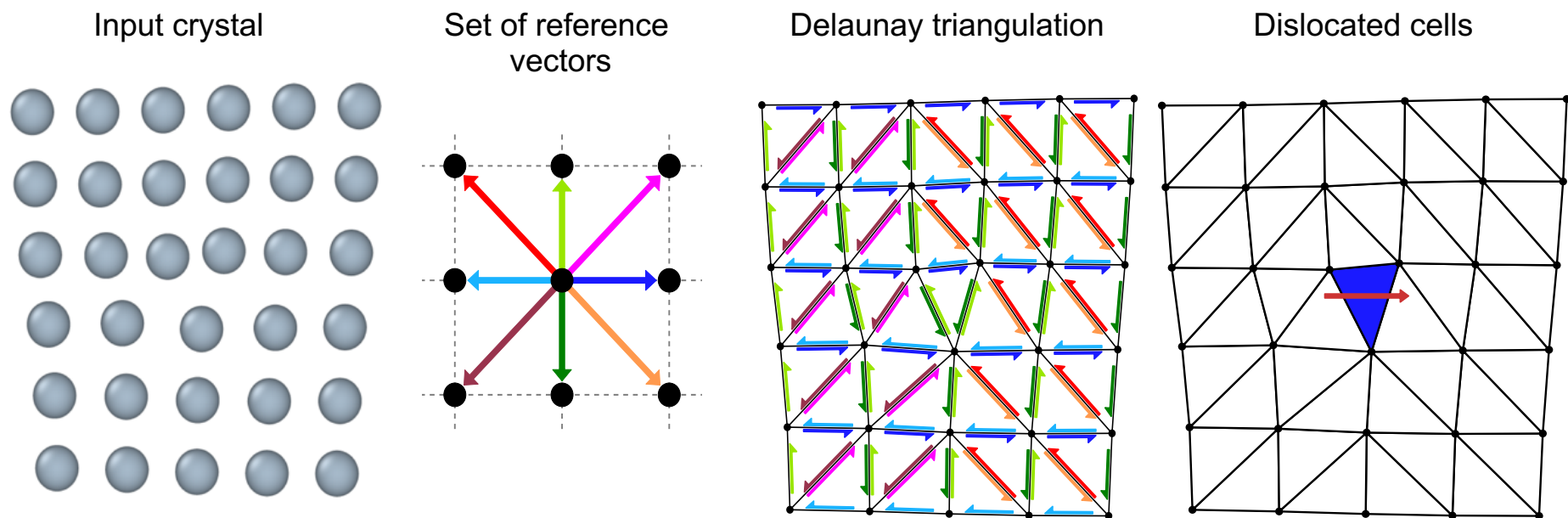
MD spatial decomposition scheme:



DXA line sweeping process:



# Dislocations as incompatibilities in a discretized elastic field



## Algorithm:

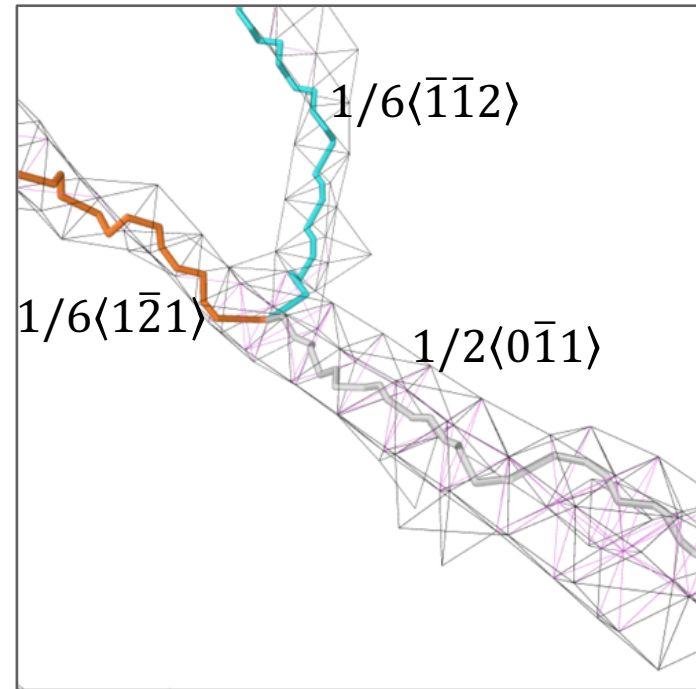
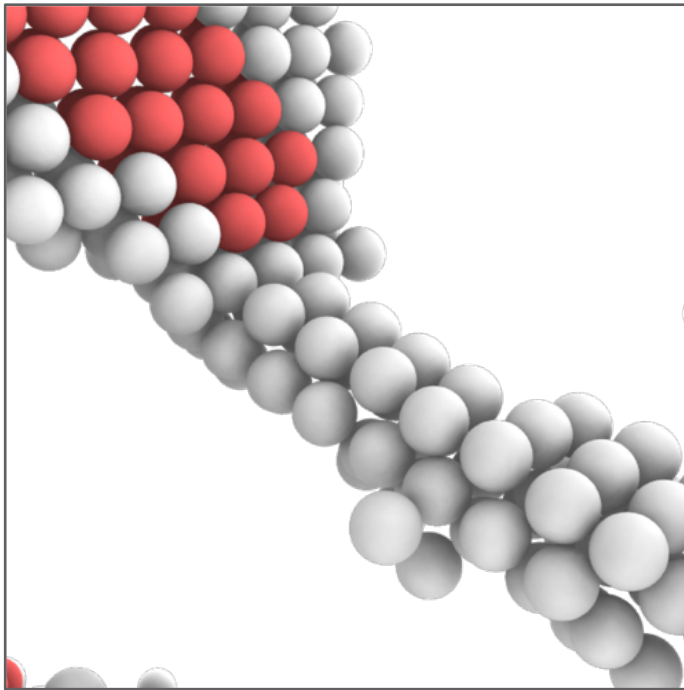
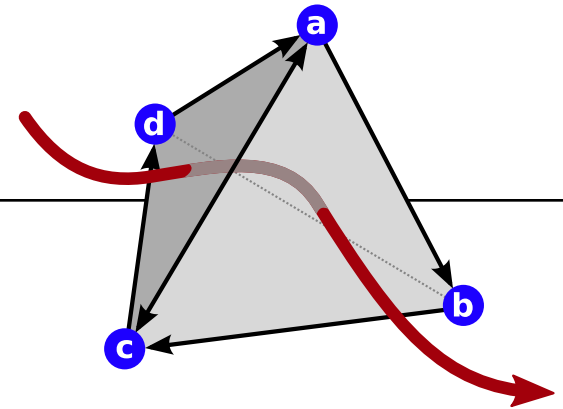
1. Compute Delaunay triangulation.
2. Assign an ideal reference vector  $\mathbf{L}_{ab}$  to each edge:

$$\mathbf{x}_{ab} = \mathbf{x}_b - \mathbf{x}_a \quad \mathbf{L}_{ab} = \min \arg_{\mathbf{L}_i \in \mathcal{L}} |\mathbf{x}_{ab} - \mathbf{L}_i|$$

A. Stukowski.  
JMPS 70 (2014), 314



# Extraction of dislocation segments



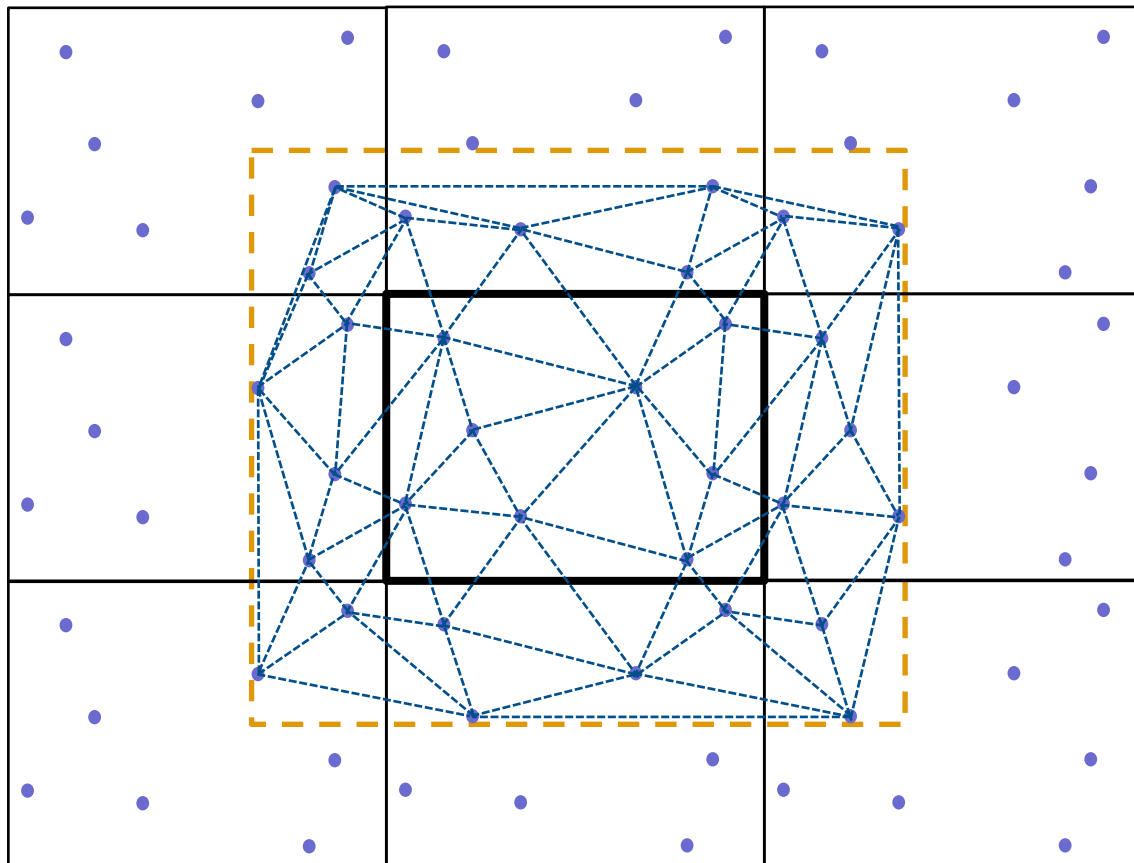
# Delaunay tessellation with PBCs/domain decomposition

Ghost atom layer must be wide enough to guarantee a consistent Delaunay topology in the overlap region:

***comm\_modify cutoff 12.0***

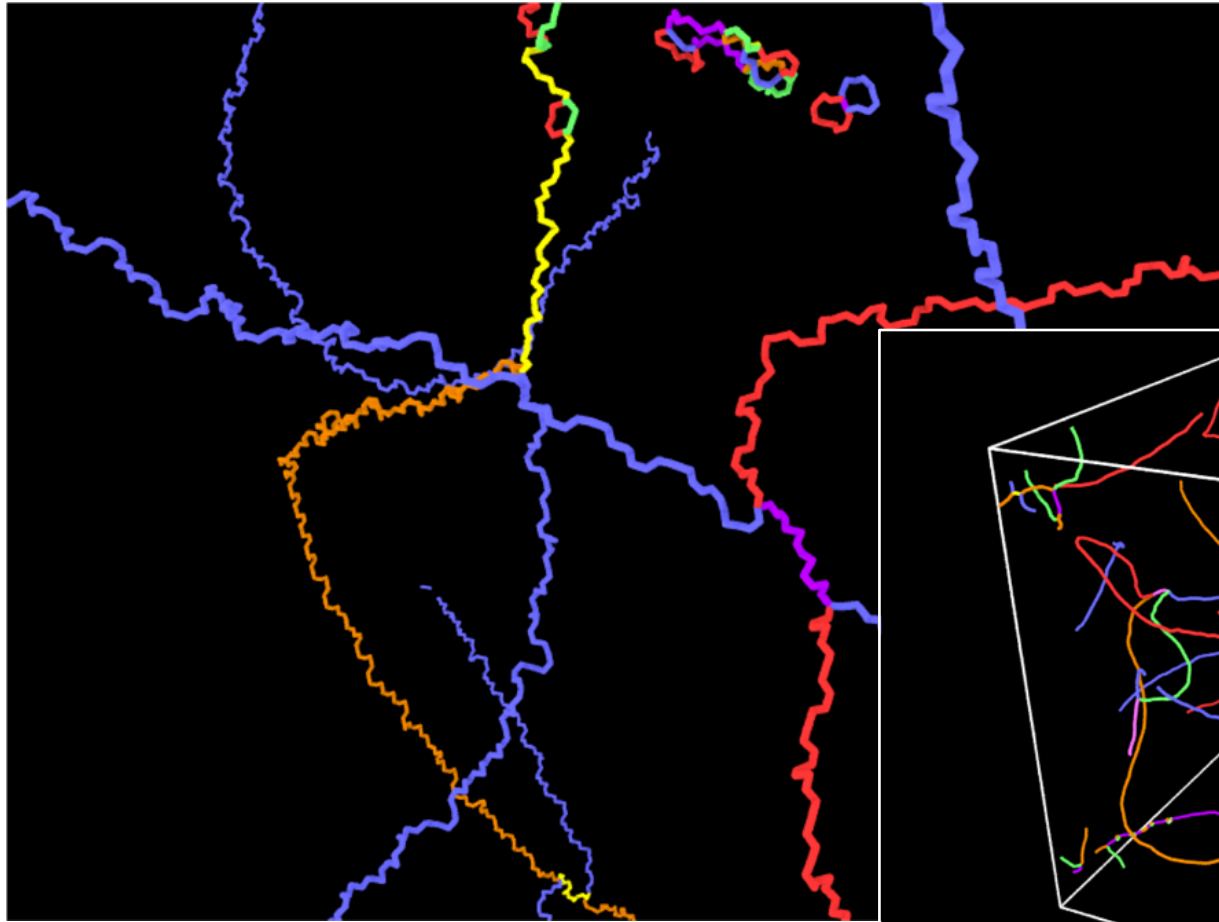
**Delaunay triangulation:**

*Geogram* library by INRIA (France)

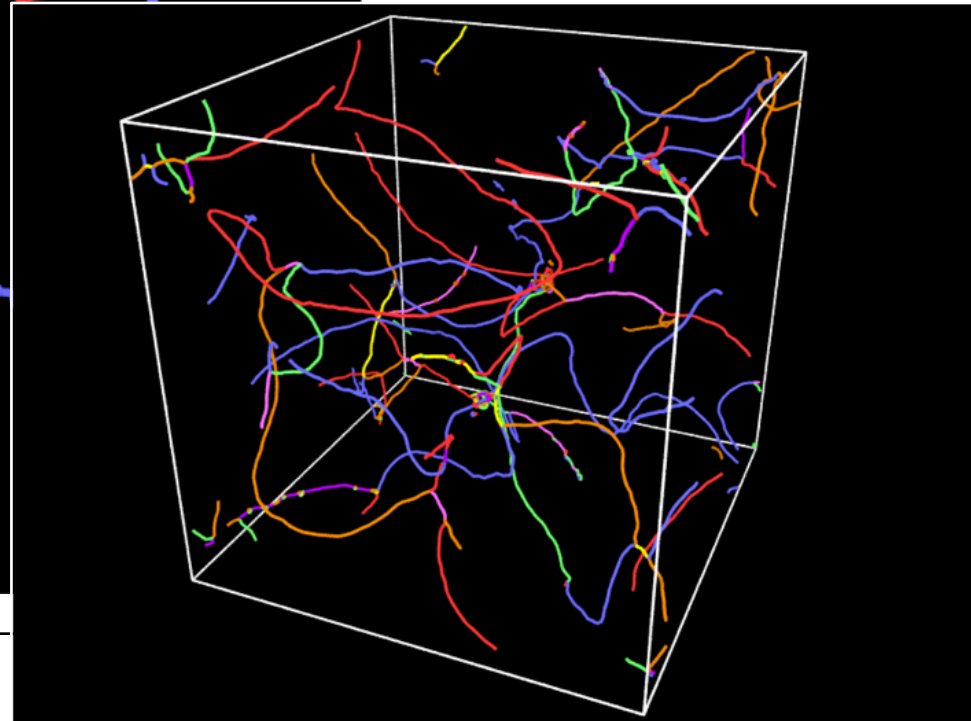




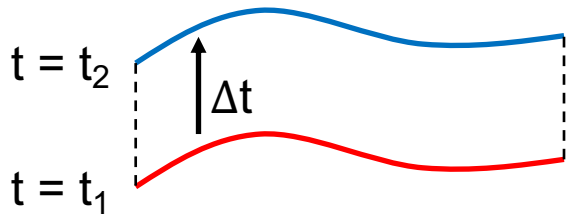
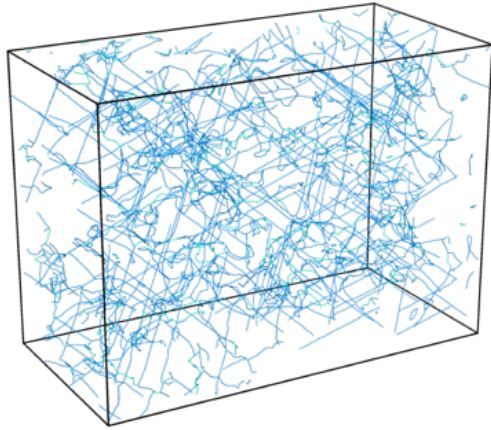
# Parallelized dislocation detection algorithm



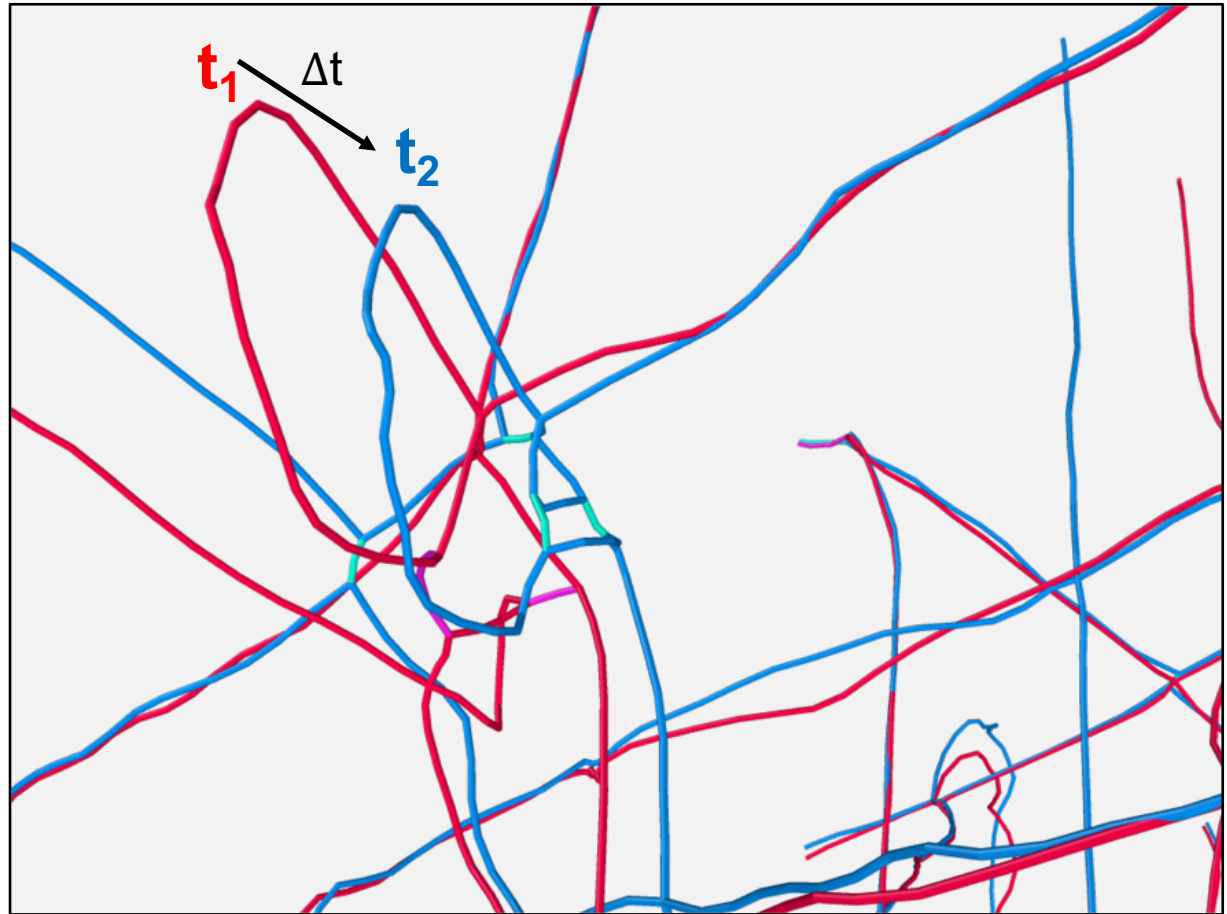
- Implementation currently limited to fully dense and periodic single crystals



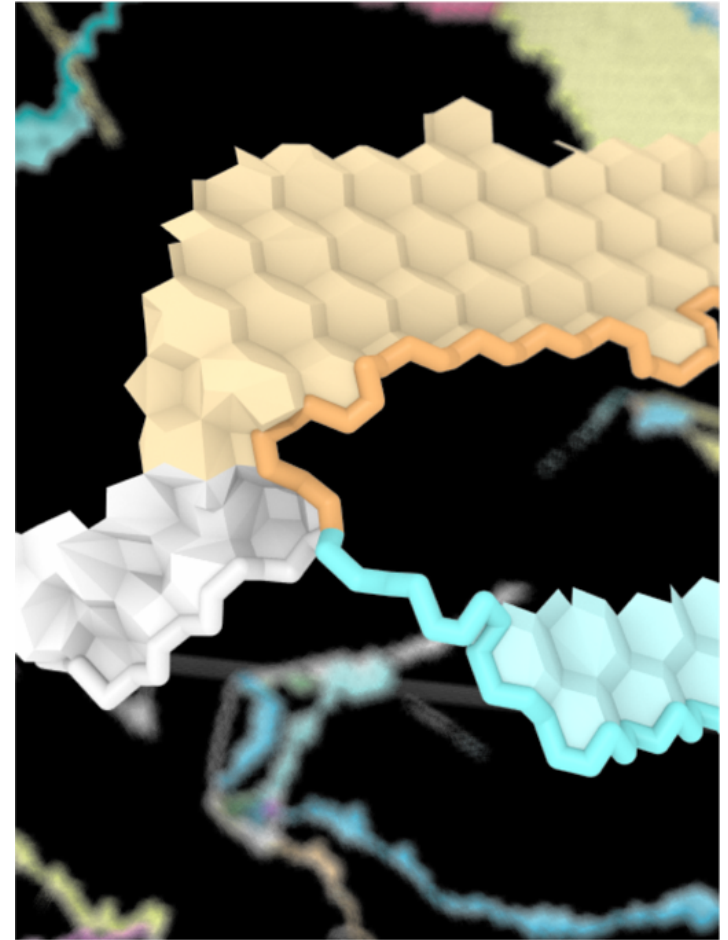
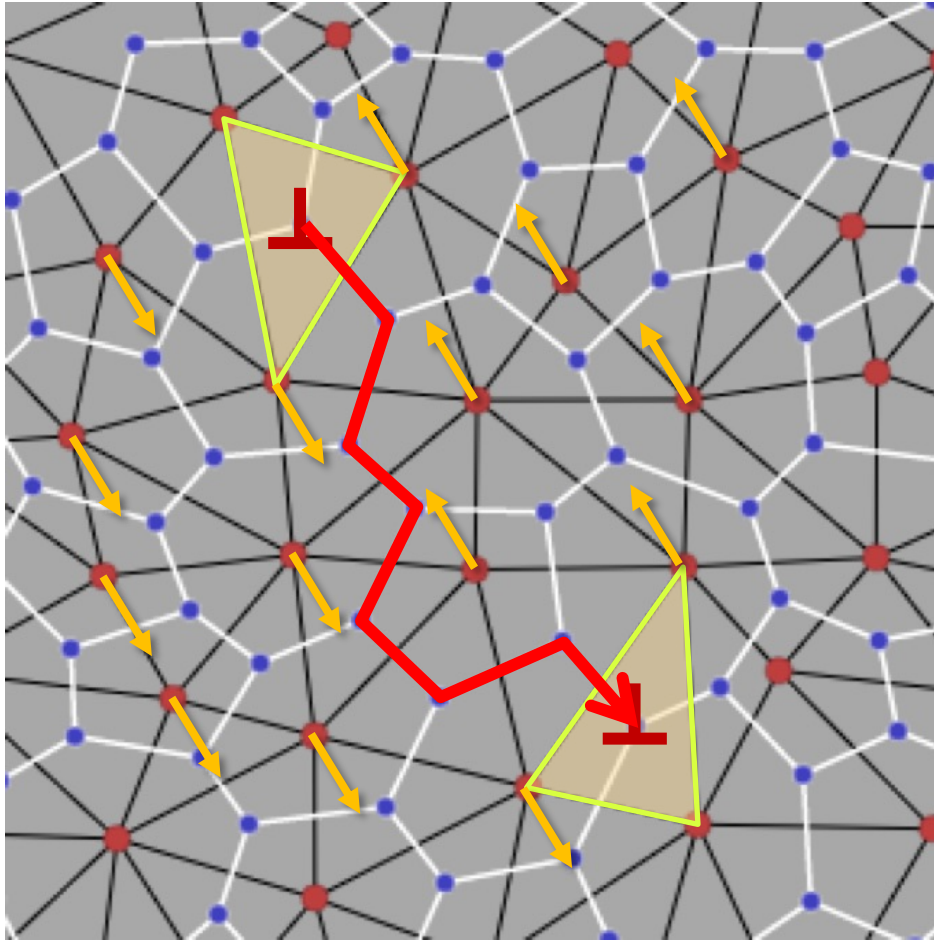
# Incremental analysis: How do dislocations move?



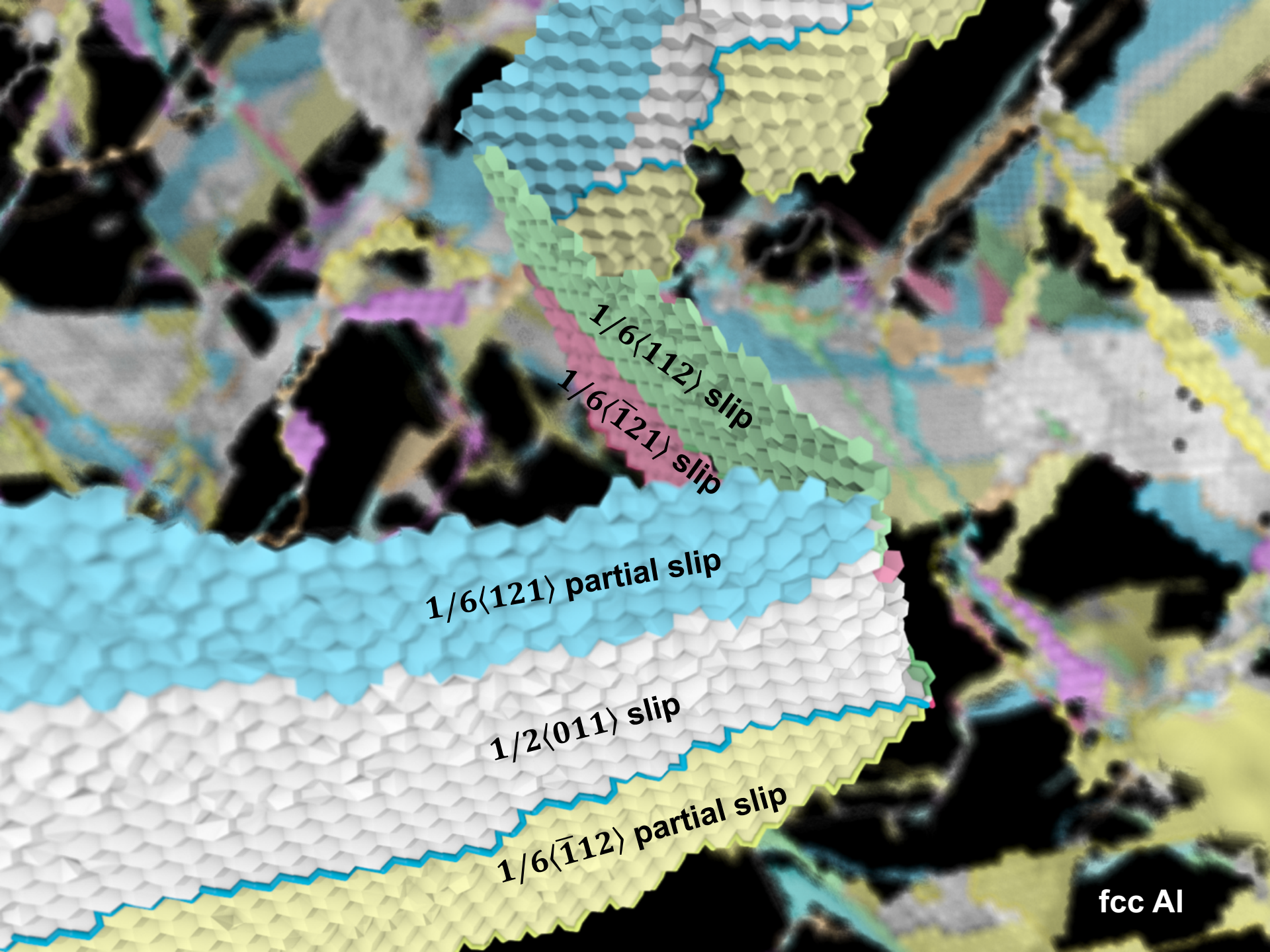
$$\Delta \epsilon^p = \sum_i \frac{\Delta A}{2V} (\mathbf{n}_i \otimes \mathbf{b}_i + \mathbf{b}_i \otimes \mathbf{n}_i)$$



# Reconstructing slip surfaces from MD trajectories

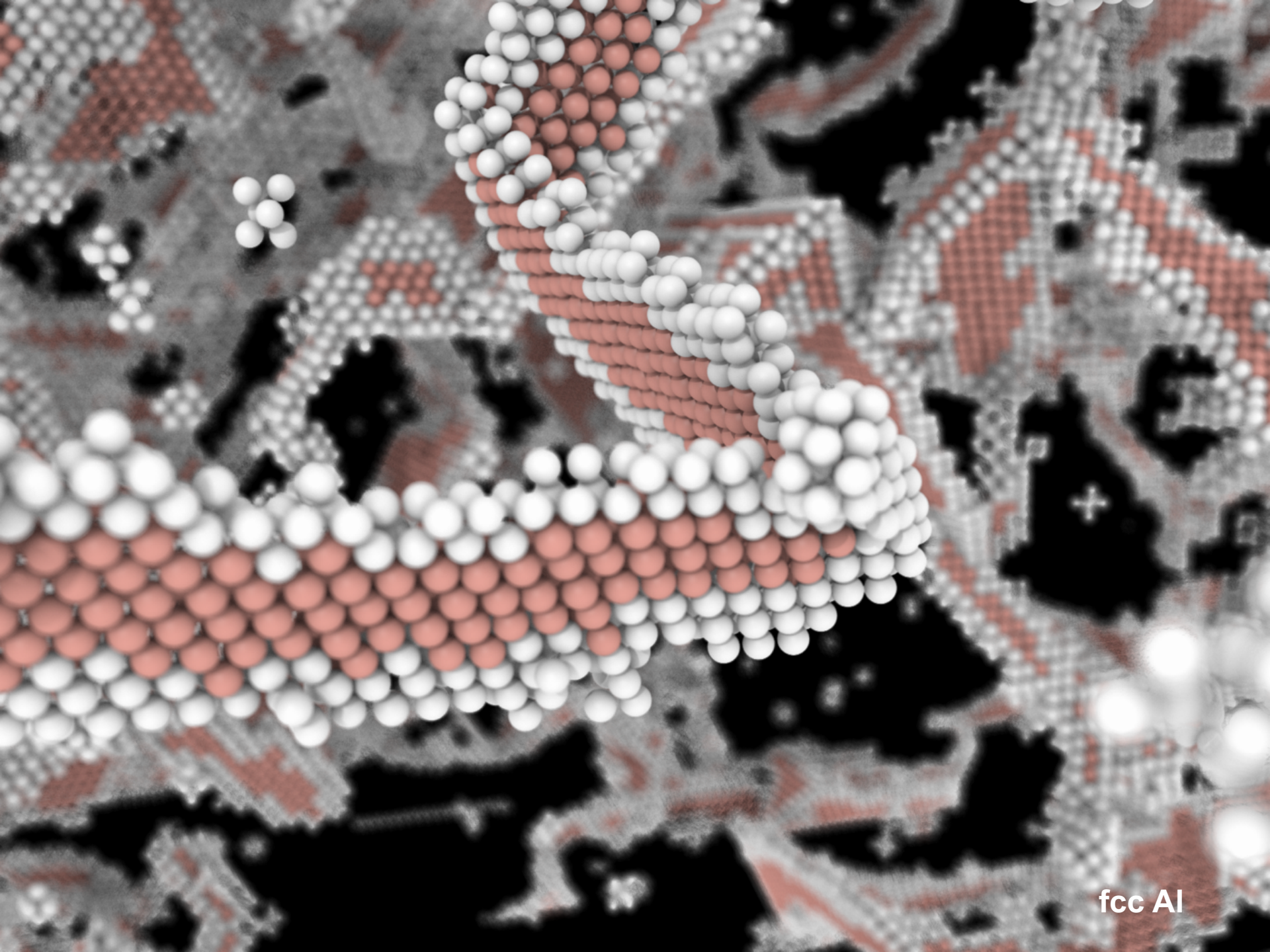




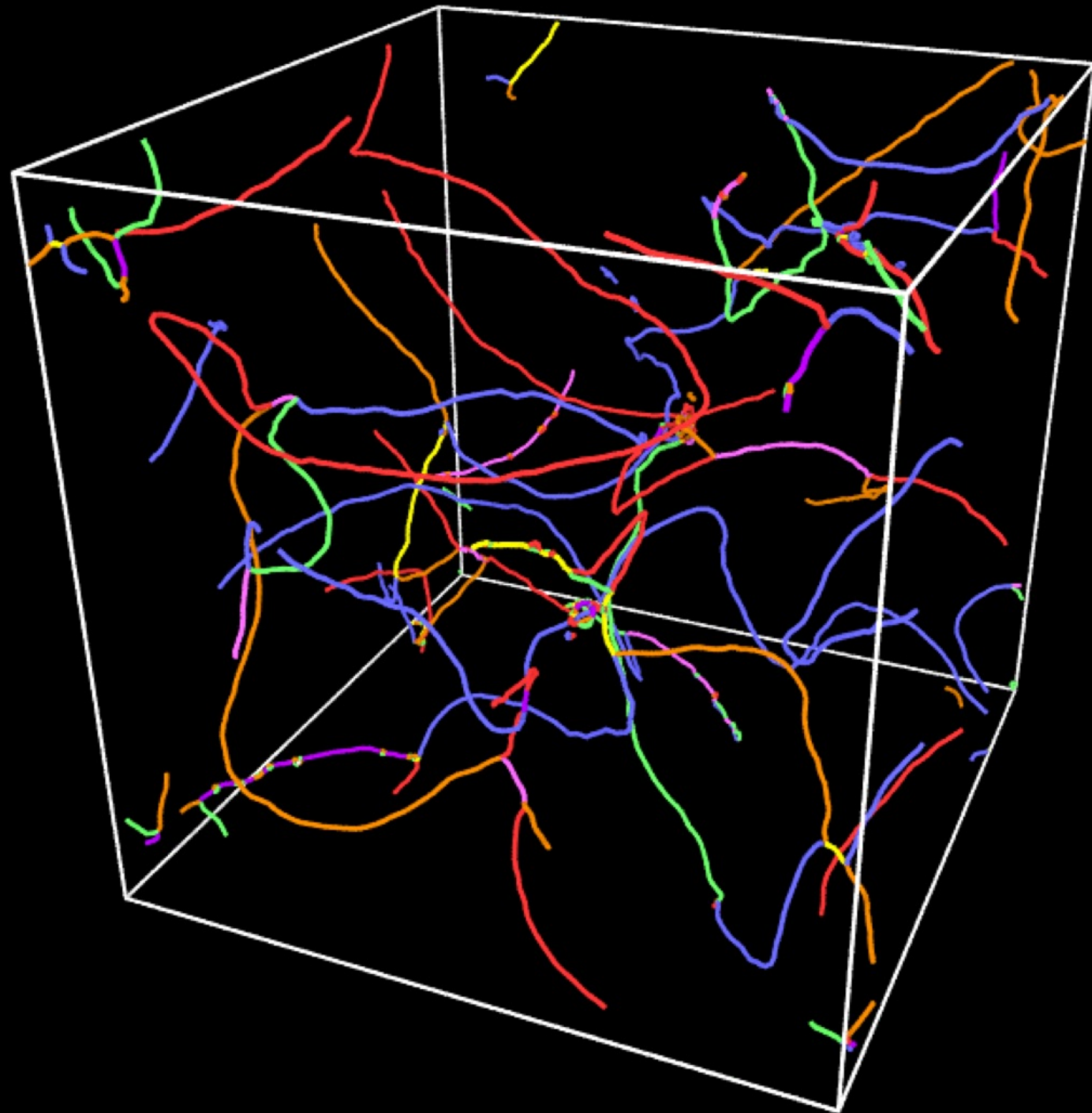


fcc Al





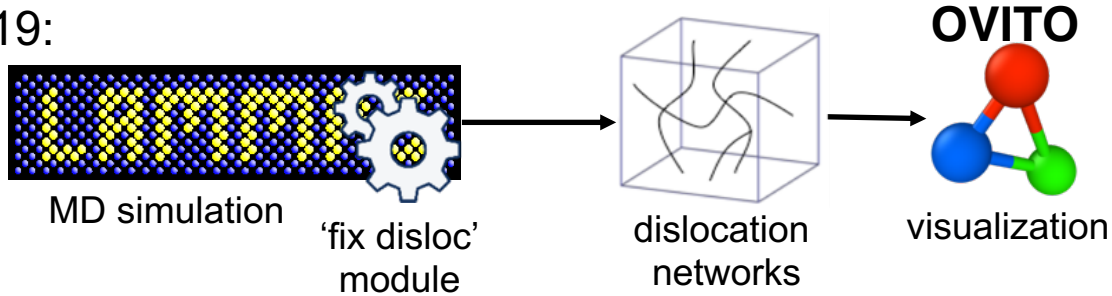
fcc Al



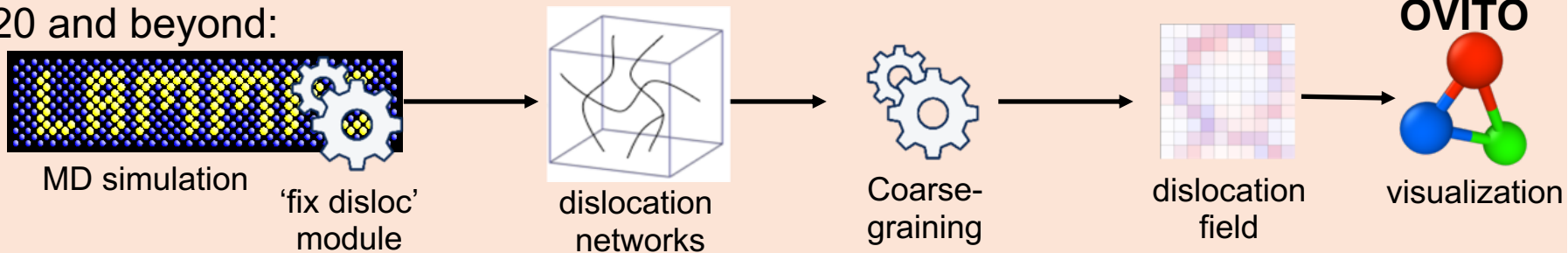


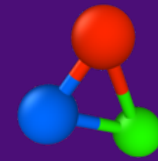
# Data analysis workflows

2019:



2020 and beyond:

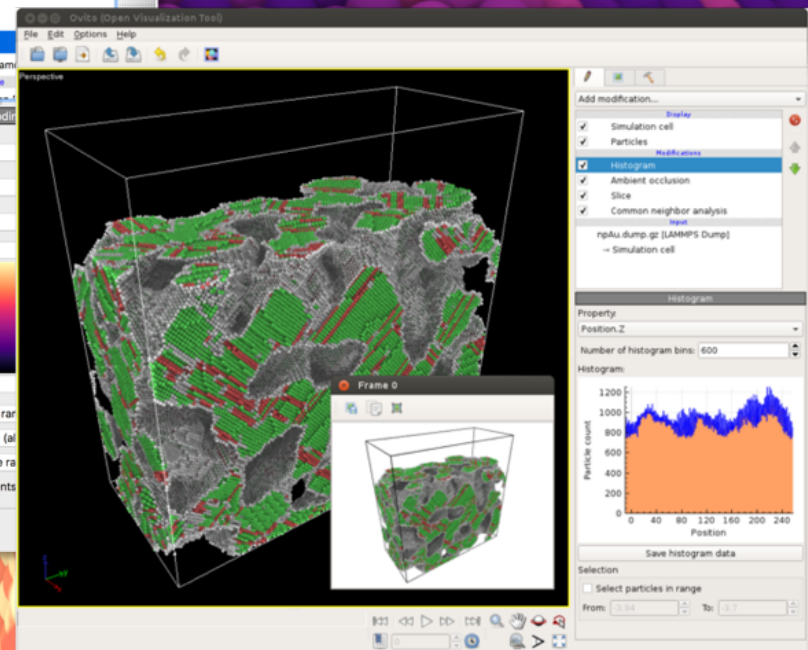
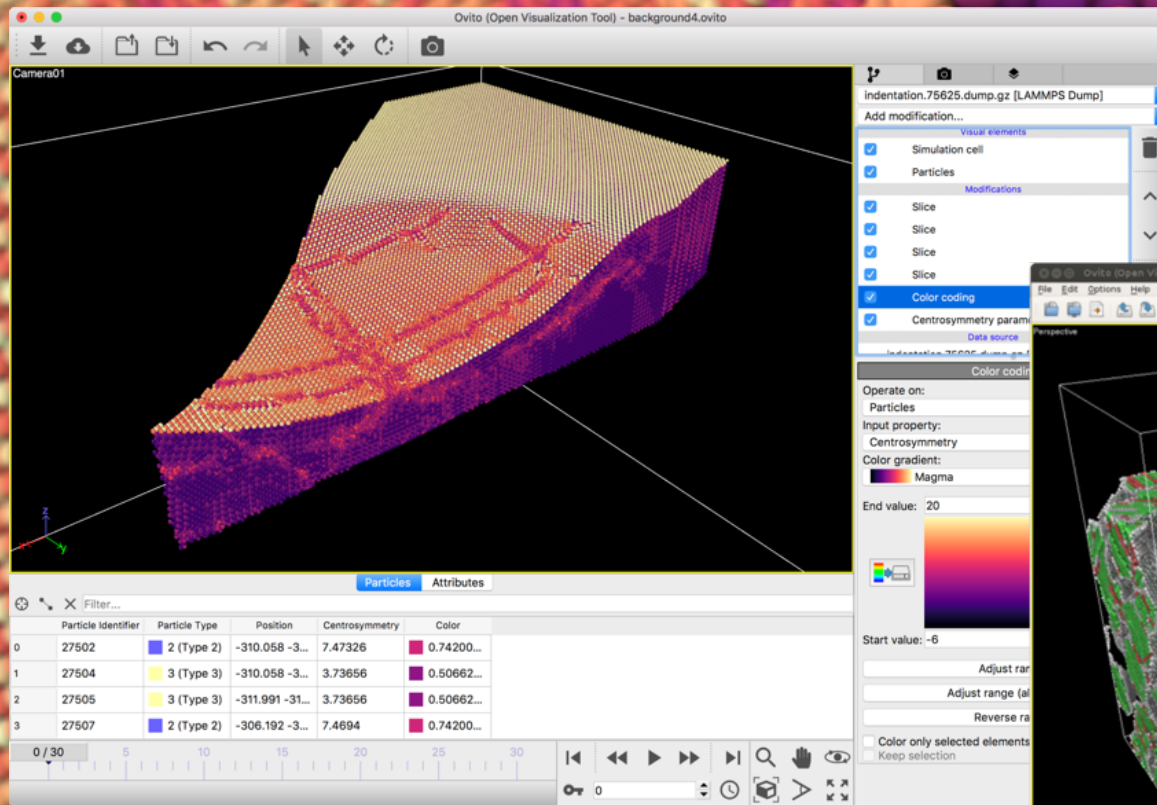




# OVITO

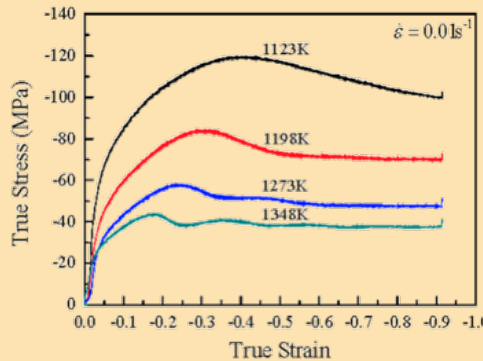
[www.ovito.org](http://www.ovito.org)

Scientific data analysis and visualization  
software for materials simulations

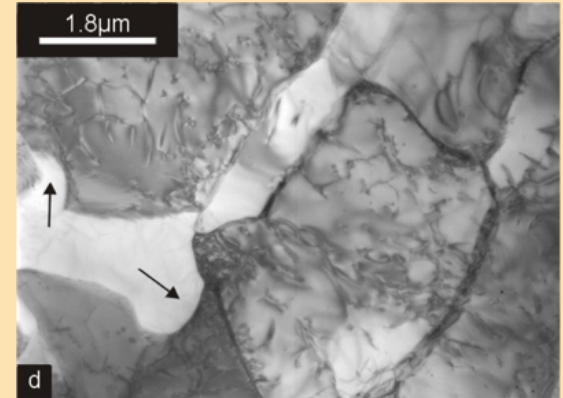


# Data visualization and analysis – From MD simulations to insights

## Experiment

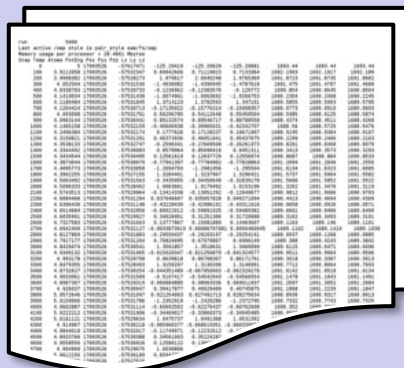


Microscopy &  
Imaging



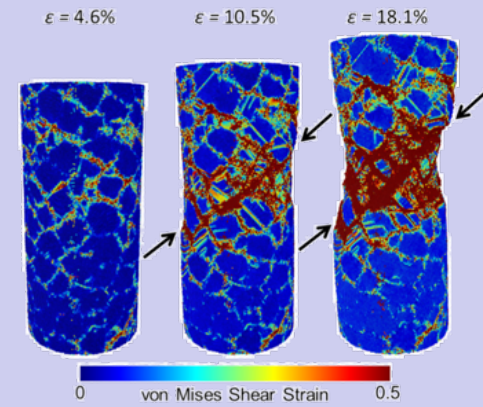
## Simulation

Raw output data

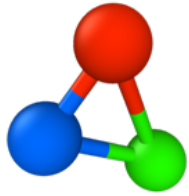


Data analysis &  
Visualization

“in-silico microscopy”



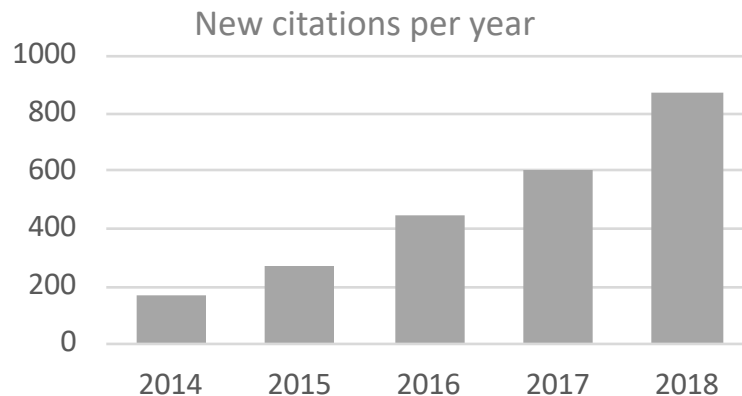




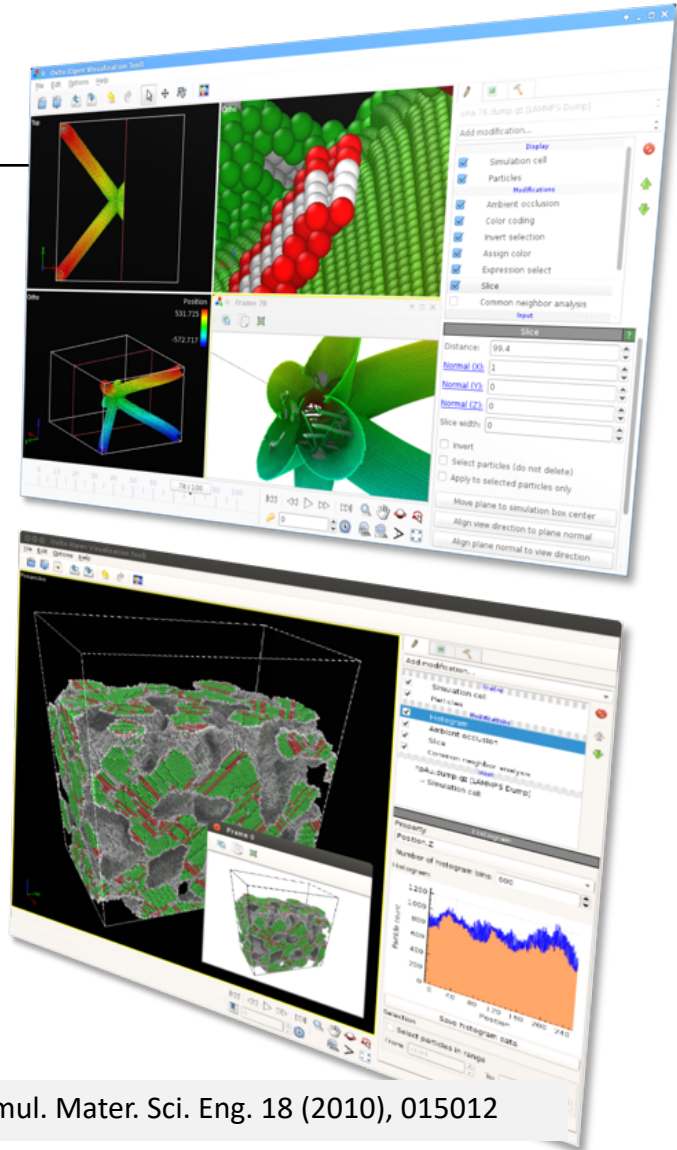
# OVITO Software Package

OVITO is among the most widely-used data analysis and visualization solutions for atomistic simulations

- 3200+ scientific publications using OVITO
- 3+ new publications per day

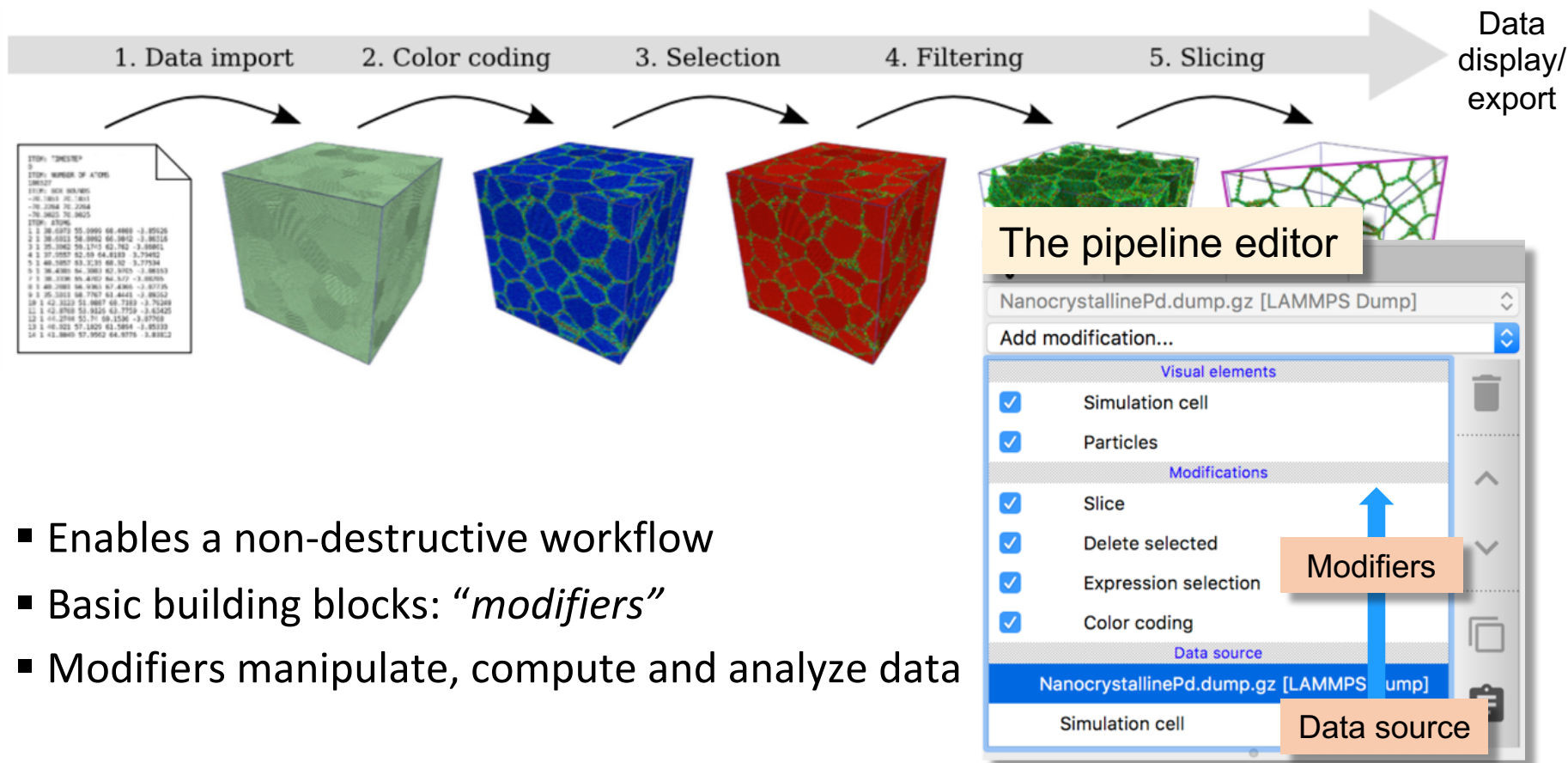


Source:  
Google Scholar



A. Stukowski. Modelling Simul. Mater. Sci. Eng. 18 (2010), 015012

# Processing pipeline



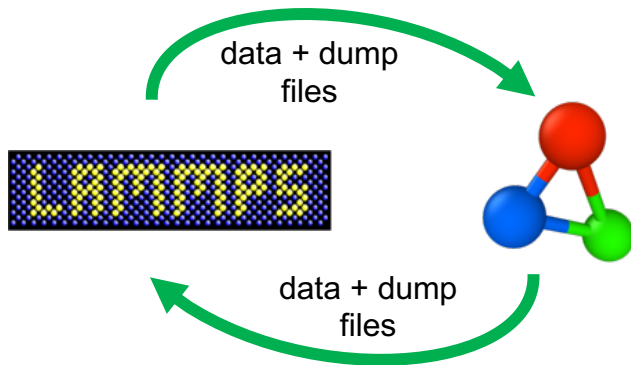
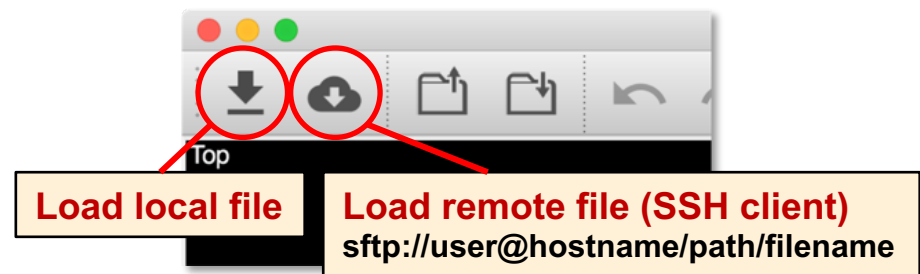
- Enables a non-destructive workflow
- Basic building blocks: “*modifiers*”
- Modifiers manipulate, compute and analyze data

# Simulation data input/output

- Automatic detection of file sequences:

```
simc_0.dump  
simc_100.dump  
simc_200.dump  
simc_300.dump  
...  
→ simc_*.dump
```

- Support for .gz compressed files
- Built-in SSH/SCP client for reading remote files



- More input formats:
  - XYZ (basic and extended variants)
  - NetCDF** (written with *'dump netcdf'* command)
  - CFG, GSD/HOOMD, IMD, PDB, GALAMOST, DL\_POLY
  - Ab initio codes:** POSCAR, FHI-aims, QE, CASTEP
  - Volumetric:** XSF, Cube, CHGCAR
  - Geometry:** OBJ, STL, VTK



# OVITO's data model

- Atomistic models: A set of *particle properties*, i.e. named data arrays:

	Particle 1	Particle 2	Particle 3	Particle 4	Particle 5	Particle N
Property A	Value	Value	Value	Value	Value	...
Property B	Value	Value	Value	Value	Value	...
Property ...	...	...	...	...	...	...

- Number of particle properties is not limited, e.g.

- Position
- Type
- Identifier
- Velocity vector
- Energy
- Charge
- Selection state
- Color
- .....

**Data types:**  
Integer, real

**Dimensionalities:**  
Scalars, vectors, tensors

- Property arrays are also used for storing elements other than particles, e.g.

bonds, surface meshes, voxel grids ...

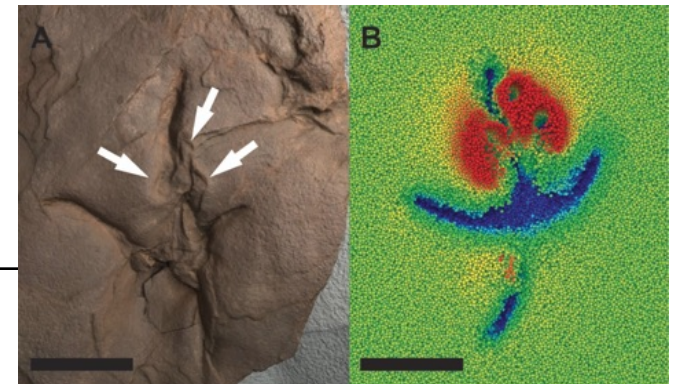
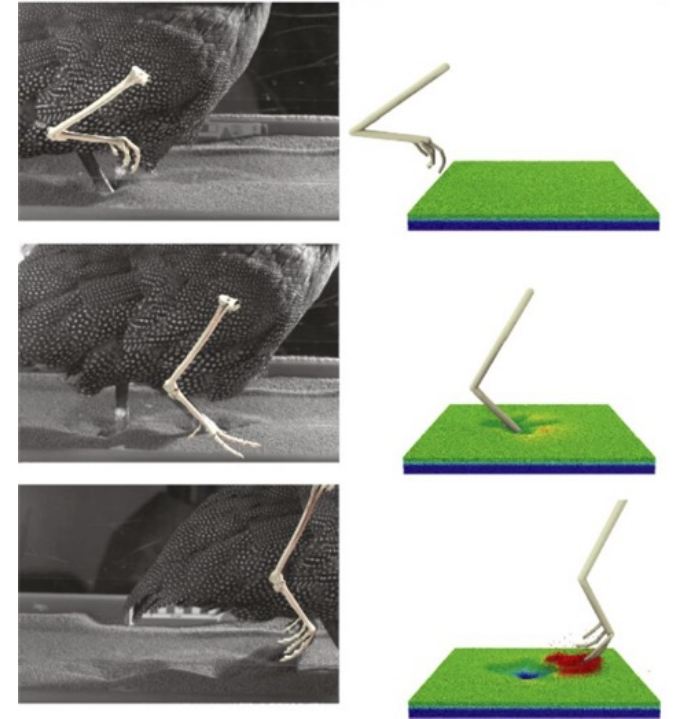
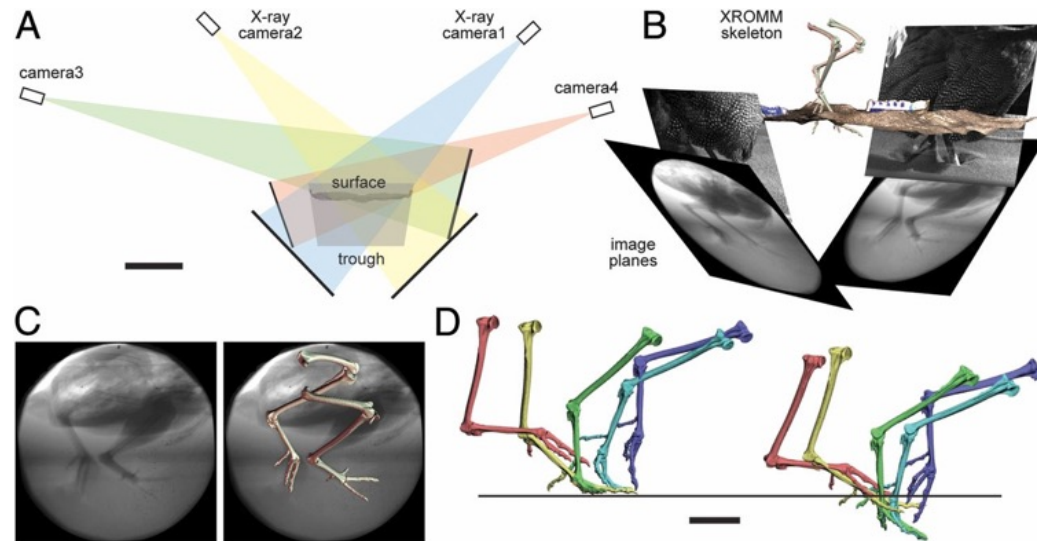
# Other types of particle simulations

## The birth of a dinosaur footprint: Subsurface 3D motion reconstruction and discrete element simulation reveal track ontogeny

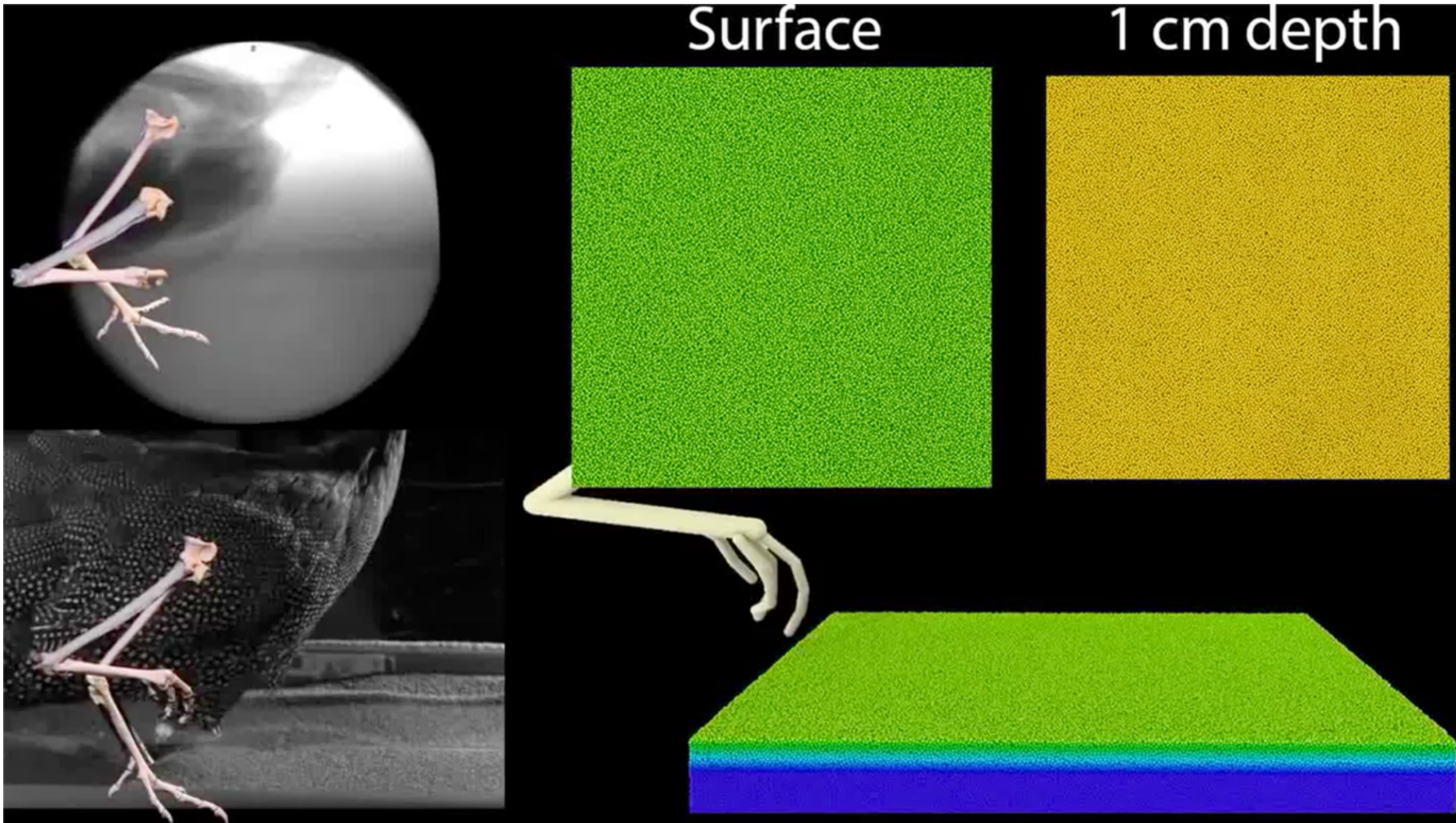
Peter L. Falkingham<sup>a,b,1</sup> and Stephen M. Gatesy<sup>b</sup>

<sup>a</sup>Structure and Motion Laboratory, Department of Comparative Biomedical Sciences, Royal Veterinary College, Hatfield AL97TA, United Kingdom; and  
<sup>b</sup>Department of Ecology and Evolutionary Biology, Brown University, Providence, RI 02912

Edited by Neil H. Shubin, The University of Chicago, Chicago, IL, and approved October 30, 2014 (received for review August 22, 2014)

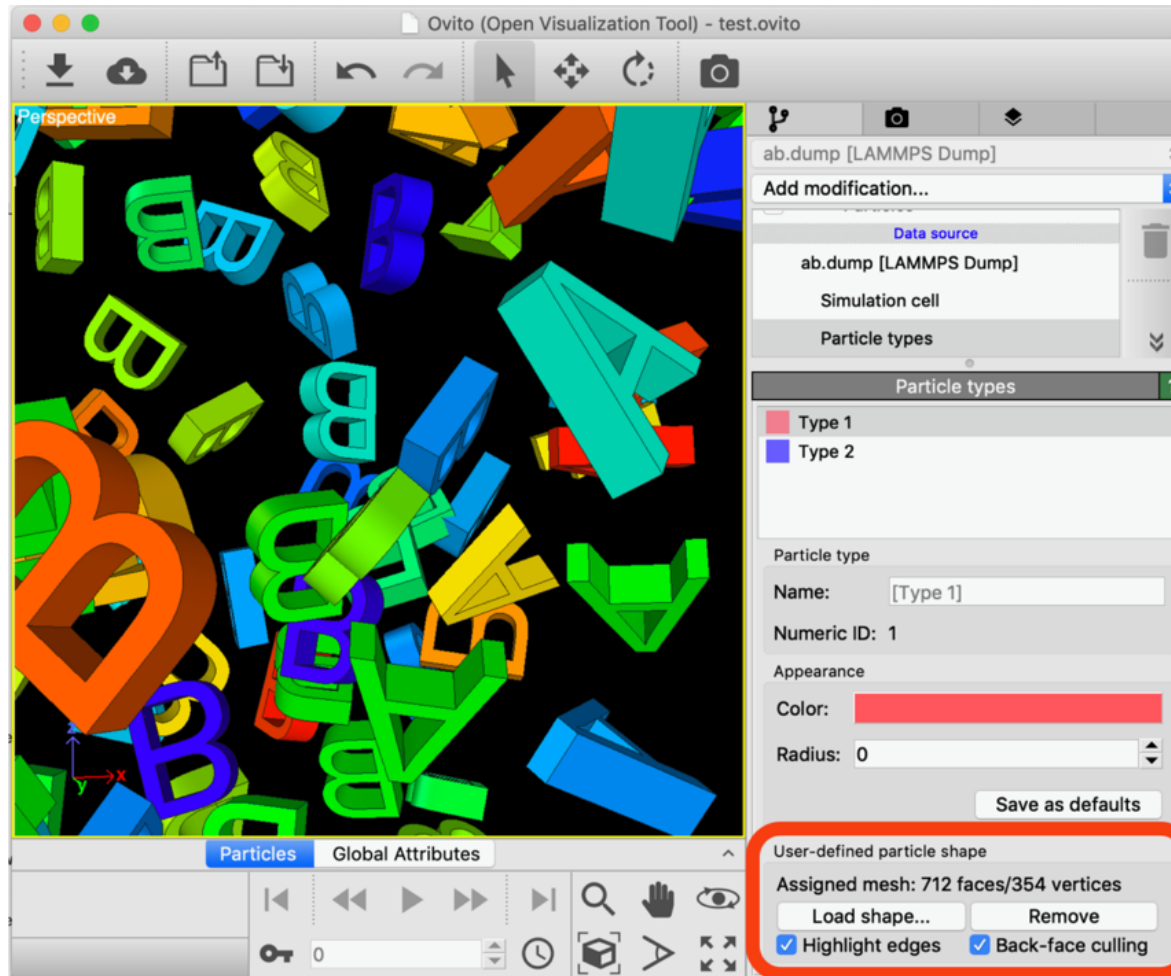


# “The birth of a dinosaur track”





# OVITO 3 will support user-defined particle shapes



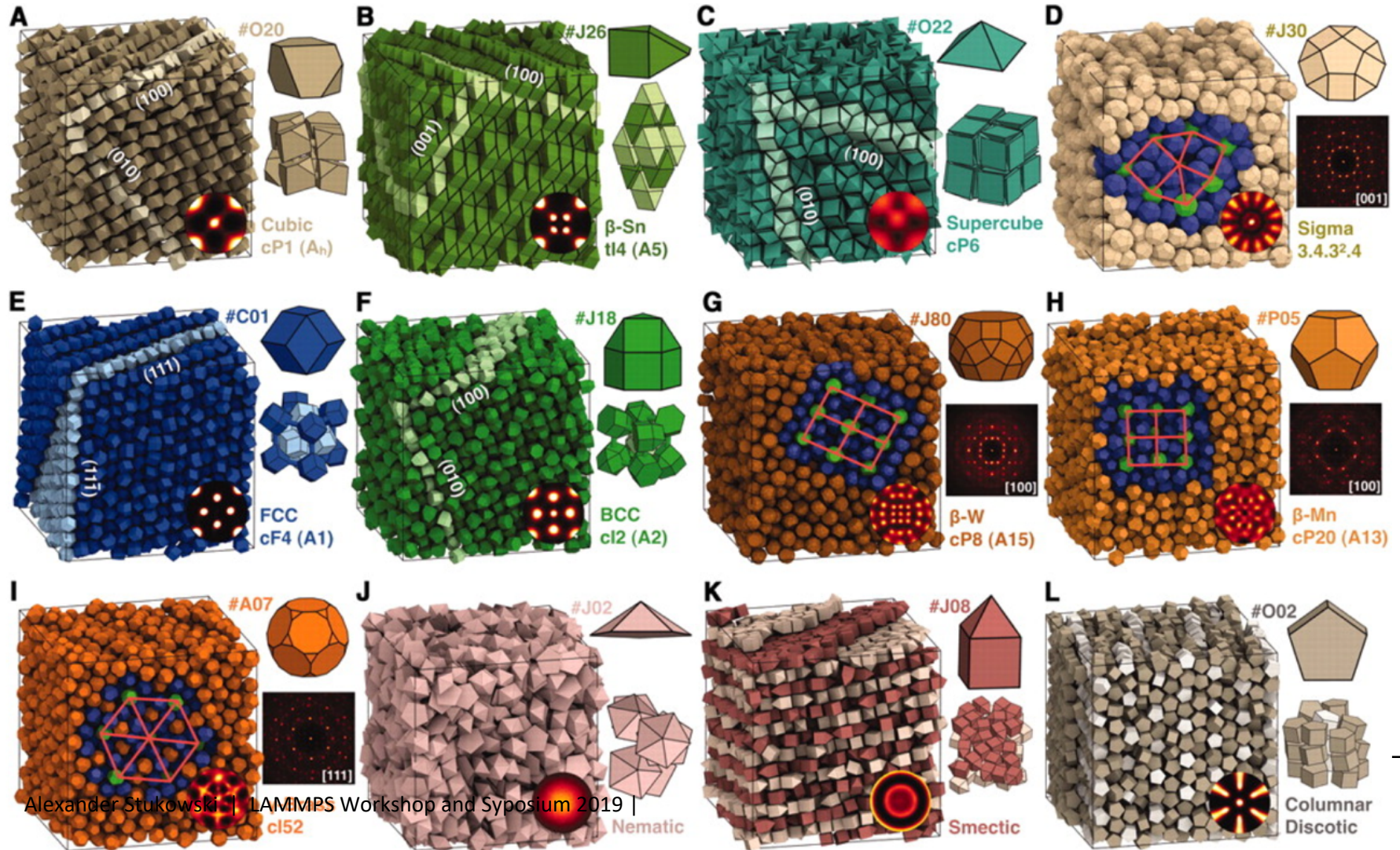
- Particle shapes are loaded from geometry files (.obj, .stl, .vtk)
- Particle orientations controlled by 'Orientation' quaternion property.

# Predictive Self-Assembly of Polyhedra into Complex Structures

Pablo F. Damasceno<sup>1,\*</sup>, Michael Engel<sup>2,\*</sup>, Sharon C. Glotzer<sup>1,2,3,†</sup>

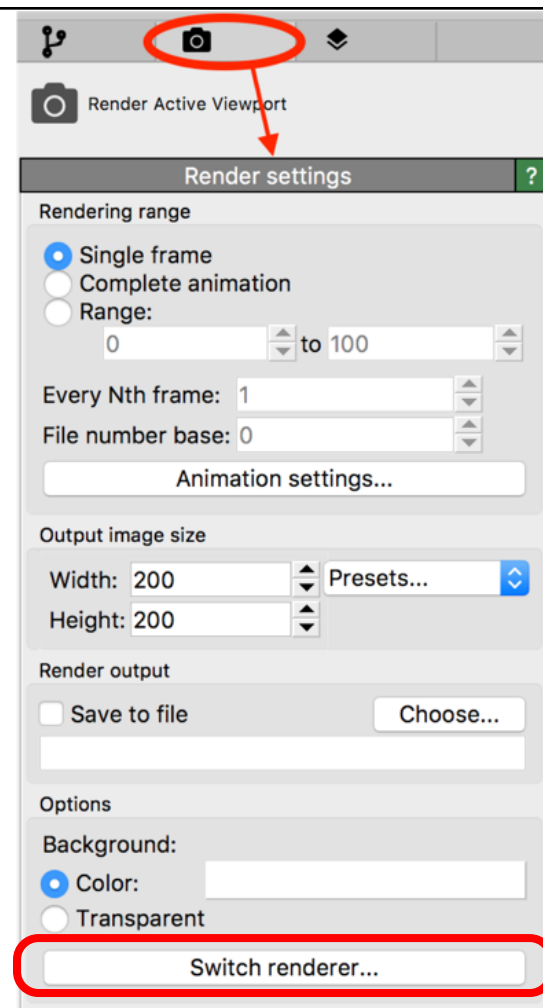
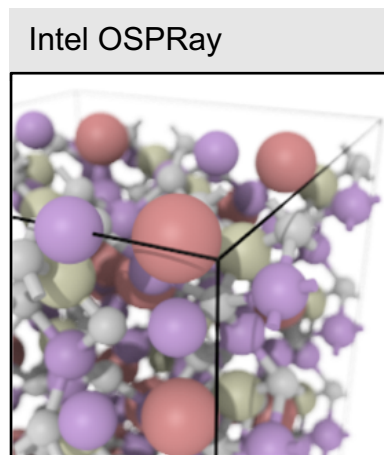
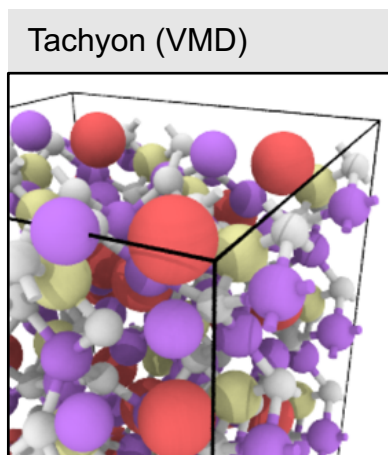
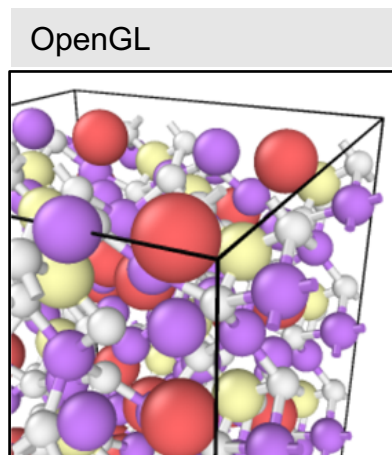
+ See all authors and affiliations

Science 27 Jul 2012:  
Vol. 337, Issue 6093, pp. 453-457  
DOI: 10.1126/science.1220869



# Image rendering

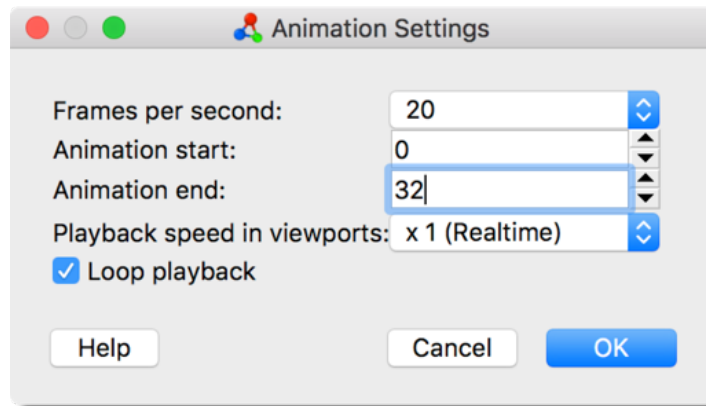
Integrated rendering engines:



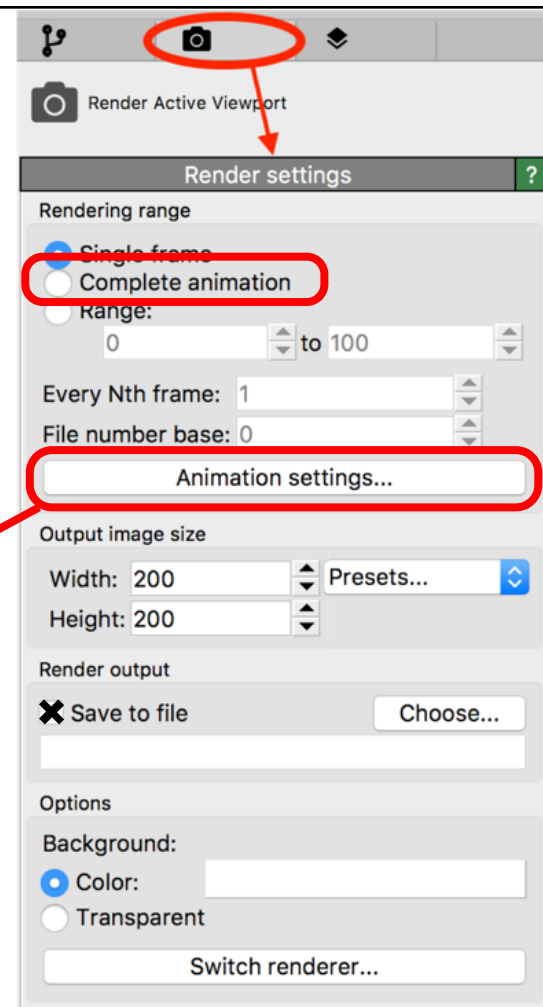


# Animation rendering

- Can produce encoded videos in AVI, MP4 or MOV formats (also animated GIFs, but poor quality)
- Alternative approach: Render a series of image files (img0.png, img1.png, img2.png, ...) and use an external video encoding tool



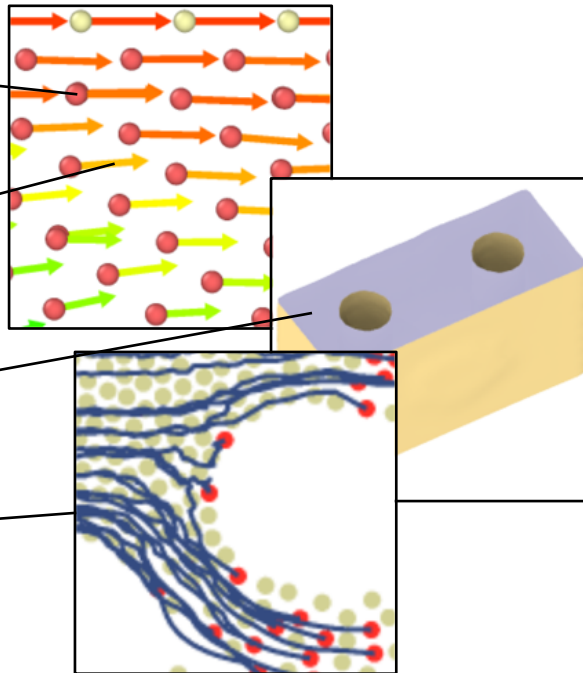
Time slider & timeline:



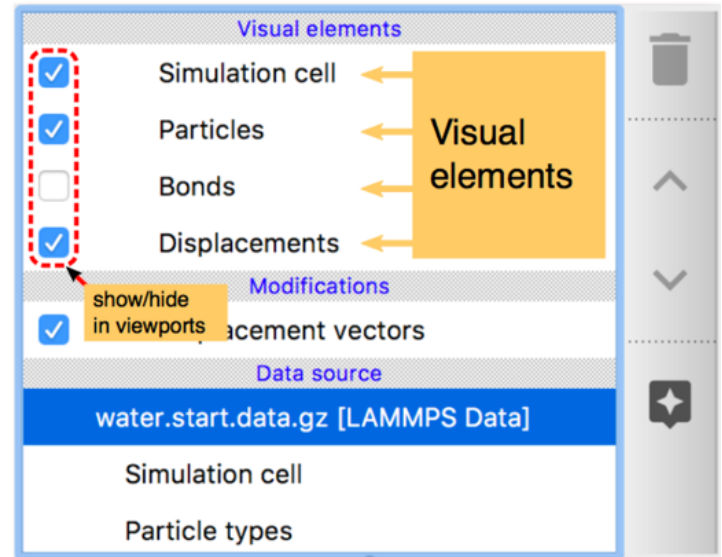
# Visualization elements

*Visual elements* are graphical representations of data.

- **Particles**
- **Bonds**
- **Vector arrows**
- **Simulation cell**
- **Surface meshes**
- **Polyhedra**
- **Trajectory lines**
- **Dislocation lines**
- ...

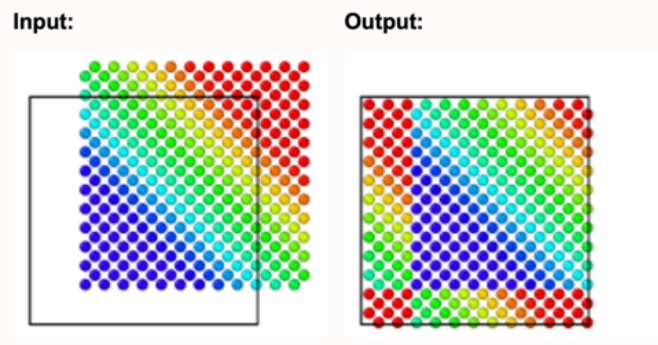


The *Visual elements* section of the pipeline editor:

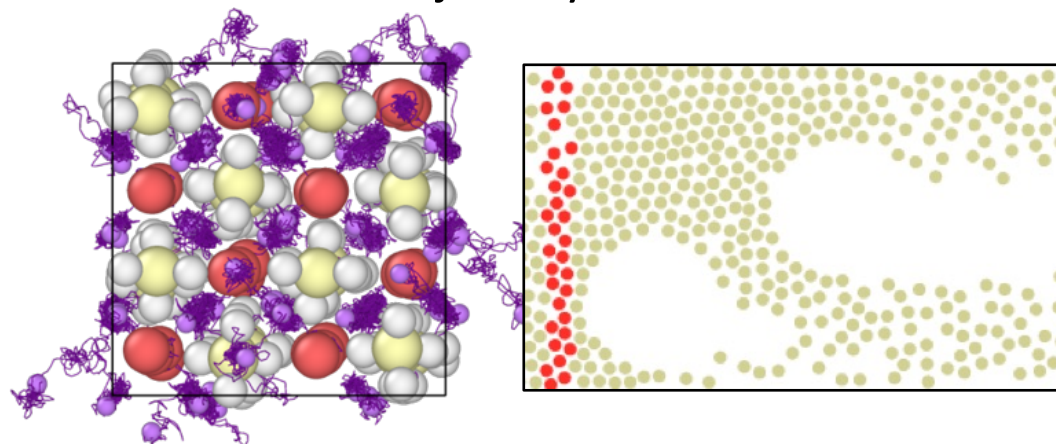


# Trajectory wrapping/unwrapping/interpolation

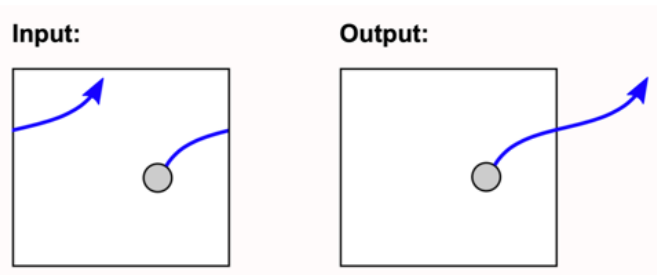
## ■ Fold trajectories:



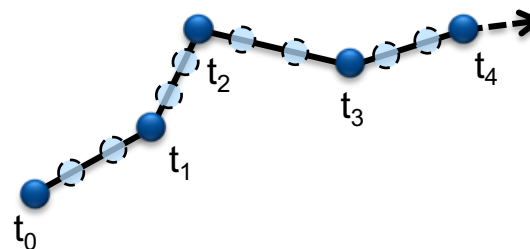
## ■ Visualize trajectory lines:



## ■ Unfold trajectories:

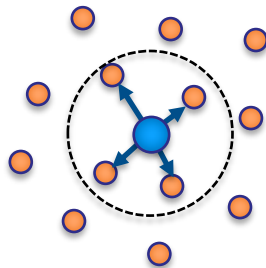
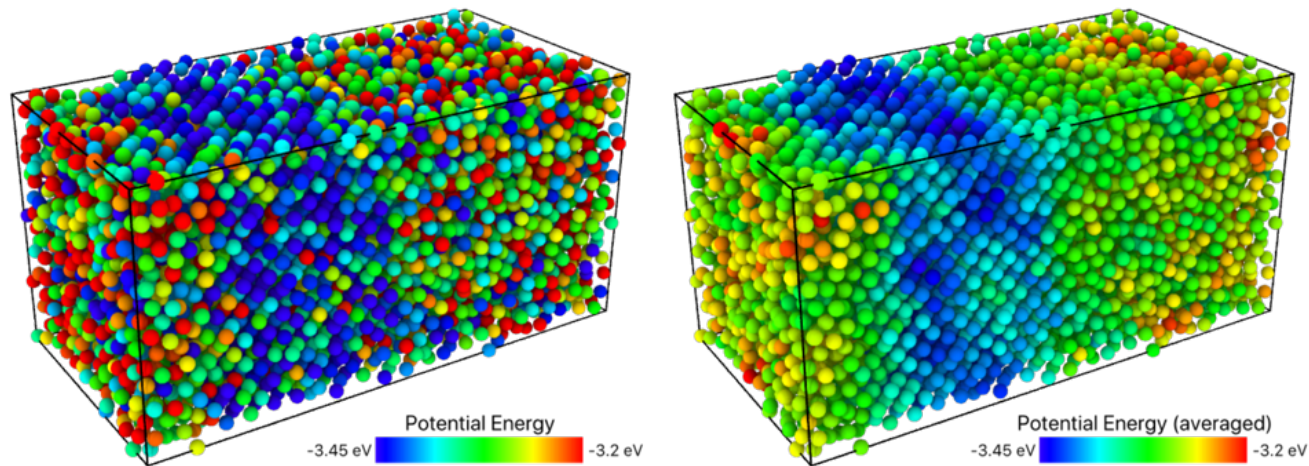


## ■ Interpolate trajectories:





# The *Compute Property* modifier



Compute property ?

**Output property**

SmoothedEnergy

☐ Compute only for selected particles

**Expression**

PotentialEnergy/(NumNeighbors+1)

**Neighbor particles** ?

☒ Include neighbor terms

Cutoff radius: 3.5

**Neighbor expression**

PotentialEnergy/(NumNeighbors+1)

**Variables** ?

Variables which can be referenced in the expressions:

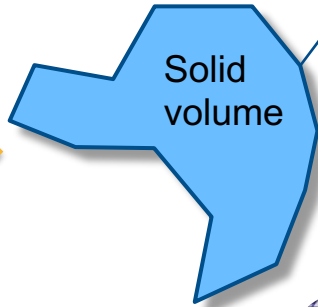
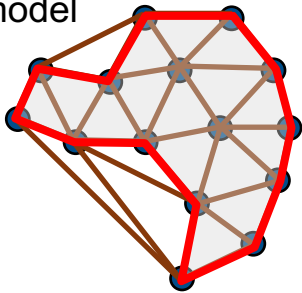
**Particle properties:**

- Position.X
- Position.Y
- Position.Z

$$P(i) = F(i) + \sum_{j \in \mathcal{N}_i} G(j), \quad \text{with } \mathcal{N}_i = \{j: |\mathbf{r}_i - \mathbf{r}_j| < R_c\}$$

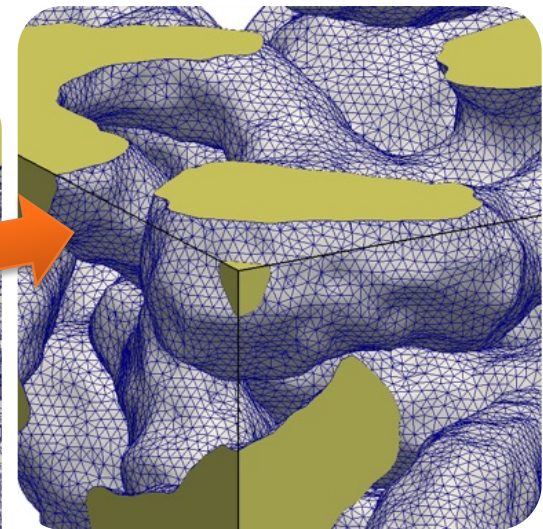
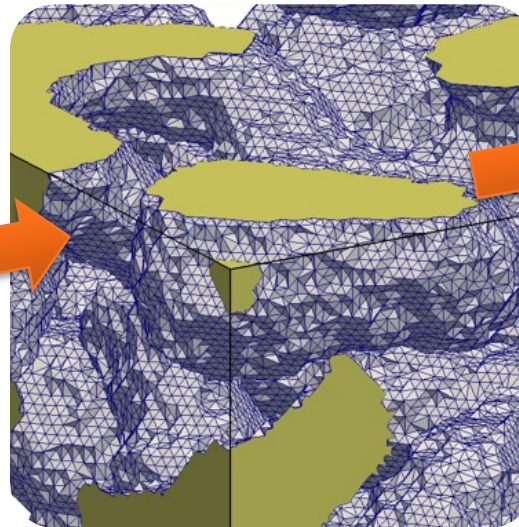
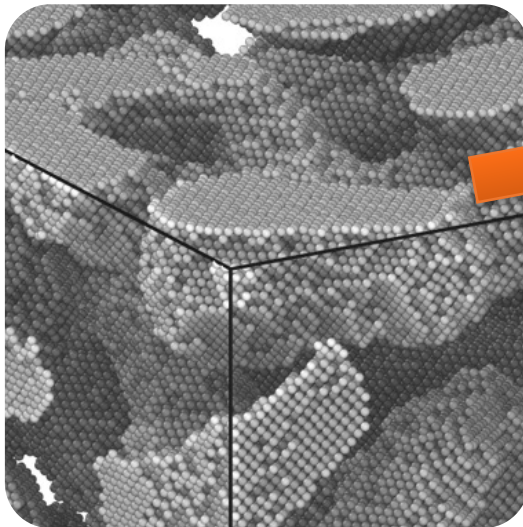
# Surface mesh construction from atomistic models

Atomistic  
model



Solid  
volume

Surface  
geometry



Stukowski, JOM 66 (2014), 399

# Python scripting interface

- OVITO's Python interface provides access to almost any program function and the data model
- Use it to automate analysis or visualization tasks!
- Use it to integrate OVITO's capabilities into custom analysis workflows!

```
# Import OVITO modules.
from ovito.io import *
from ovito.modifiers import *
from ovito.data import *

# Import standard Python and NumPy modules.
import sys
import numpy

# Load the simulation dataset to be analyzed.
pipeline = import_file("../data/NanocrystallinePd.dump.gz")

# Create bonds.
pipeline.modifiers.append(CreateBondsModifier(cutoff = 3.5))

# Compute CNA indices on the basis of the created bonds.
pipeline.modifiers.append(CommonNeighborAnalysisModifier(
    mode = CommonNeighborAnalysisModifier.Mode.BondBased))

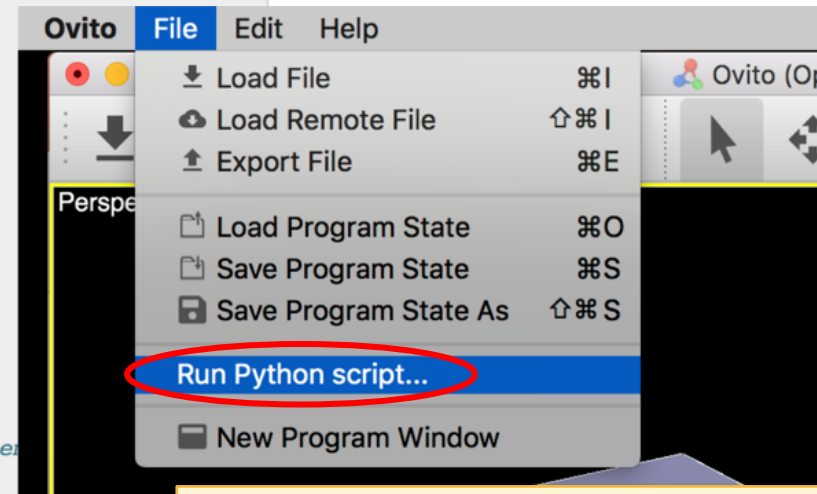
# Let OVITO's data pipeline do the heavy work.
data = pipeline.compute()

# The 'CNA Indices' bond property is a a two-dimensional array
# containing the three CNA indices computed for each bond in the system.
cna_indices = data.bonds['CNA Indices']
```

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```
./ovitos analysis_script.py simulation.dump
```

**ovitos** = script interpreter



**ovito** = graphical interface



# User-defined modifier functions

If the built-in modifiers are not sufficient,  
write your own!

The image shows the Ovito (Open Visualization Tool) interface. On the left, a Python script editor window titled "Python script" contains the following code:

```
1 import numpy
2 def modify(frame, input, output):
3     displacement_magnitudes = input.particles['Displacement']
4     msd = numpy.sum(displacement_magnitudes ** 2) / len(displacement_magnitudes)
5     output.attributes["MSD"] = msd
6     print(displacement_magnitudes[...])
```

Below the script editor, the "Script output:" window displays the following data:

```
[[-0.00291887  0.737793 -0.0208948 ]
 [-0.00262855  0.732423 -0.01155168]
 [-0.0837756 -0.490017 -0.0709522 ]
 ...
 [ 0.1477875  0.555233  0.0859024 ]
 [ 0.1516527  0.567935  0.0817078 ]
 [ 0.155412   0.580763  0.0775026 ]]
```

On the right, the Ovito main window shows the "Add modification..." dialog. The "Python script" option is selected and circled in red. Below the dialog, the "User-defined modifier name:" field is set to "Python script", and the "Edit script..." button is also circled in red. A red arrow points from the "Edit script..." button to the Python script editor window on the left.

The Ovito main window also shows a list of modifications: Simulation cell, Particles, Displacements, Python script (selected), Color coding, Displacement vectors, and Affine transformation. The data source is "NanocrystallinePd.dump.gz [LAMMPS Dump]".

# Branched pipelines

Data pipelines can be branched:

1. Visualize the same input dataset in different ways
2. Visualize different datasets in the same way, side by side

