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Context

- Mixed oxides (MOX), such as $(\text{U}_{1-x}, \text{Pu}_x)\text{O}_2$, play a key role in the production of nuclear energy. Recycling loop: 10% of France national electricity production, using spent nuclear fuel
- CEA codes modeling fuel behavior in production

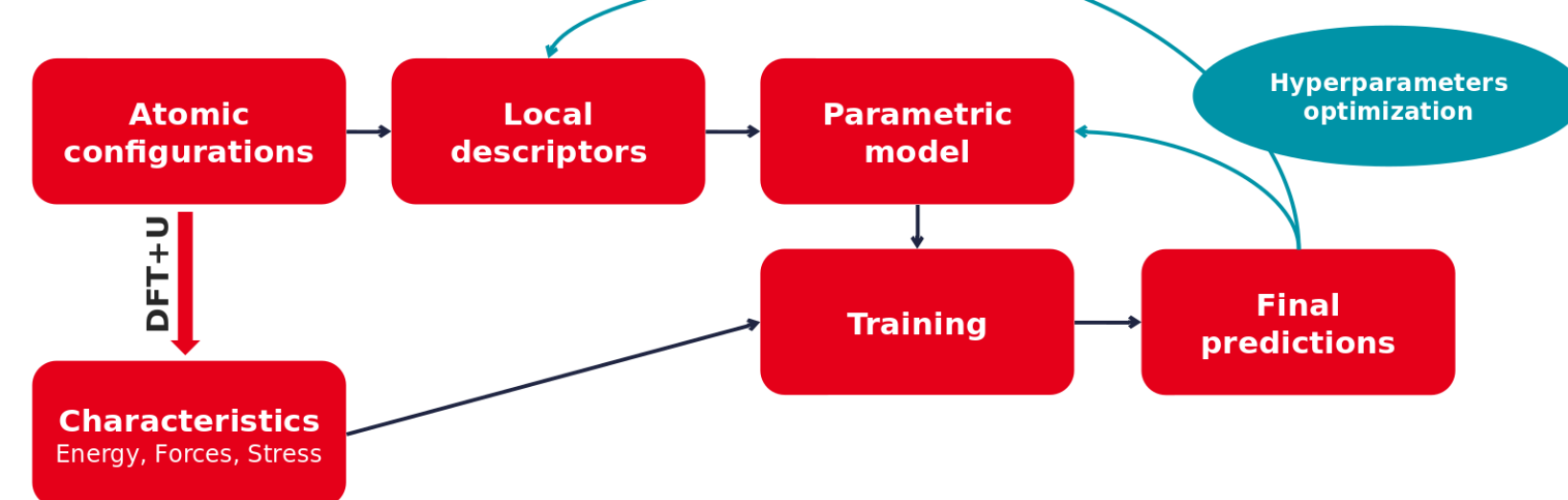
ALCYONE (PWR - Pressurized Water Reactor)
GERMINAL (SFR - Sodium-cooled Fast Reactor)



Aim

- Need to improve current models to obtain larger safety margins
- Generate a Machine Learning Interatomic Potential (MLIP)

Accurate: based on DFT
Fast: classic MD
Portable: tailored database



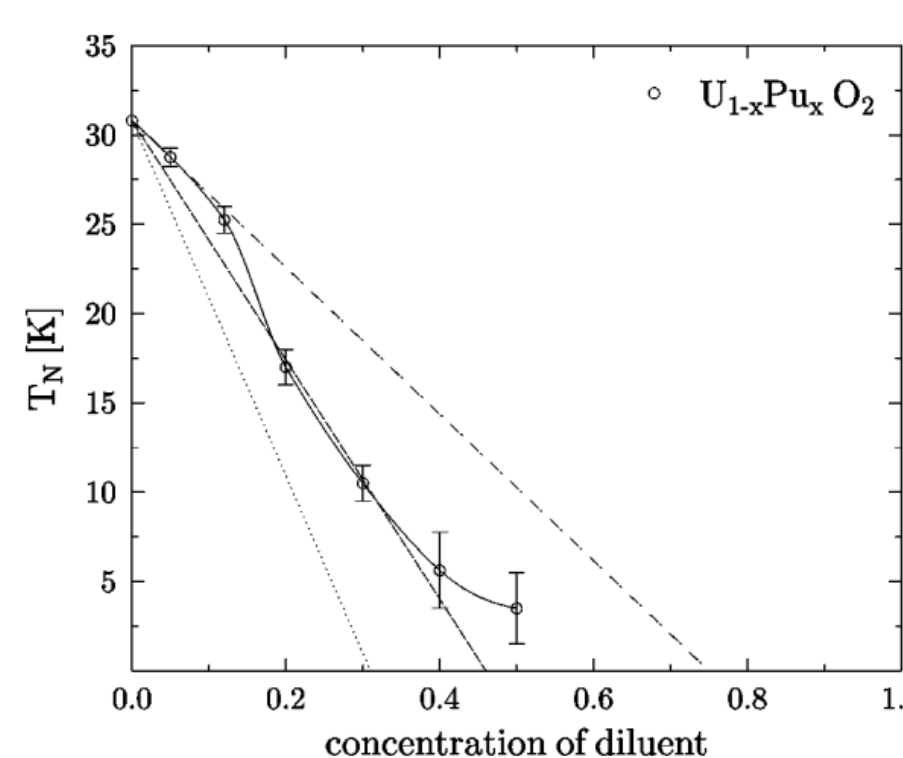
- Elliott Dubois' PhD work: MLIP for UO_2 [3] → **Transfer to PuO_2**

Experiments vs. DFT predictions

Difficulties

Doubts about PuO_2 ground state magnetic phase

- Apparent **diamagnetic** state at 4K [4], but large temperature-dependent magnetic susceptibility may indicate **AFM** structure, as seen in $\text{Th}_{1-x}\text{Pu}_x\text{O}_2$ [5] and $\text{U}_{1-x}\text{Pu}_x\text{O}_2$ [6]
- Small Néel's temperature (transition to paramagnetism) [6]



Néel temperatures as a function of Pu content (figure from [6])

<5K for $(\text{U}_{0.5}, \text{Pu}_{0.5})\text{O}_2$

Difficult to obtain experimental results because of **radioactive decay**, and **inhomogeneity** of the samples

DFT setup

- PBEsol** xc functional
- Hubbard corrections: **DFT+U**
(U,J)=(6,0) eV: **match** band gap and lattice parameter [1]
- Noncollinear magnetism + Spin Orbit Coupling (SOC)
- No Occupation Matrix Procedure (OMC) [2]
Hope SOC is enough to prevent metastability in the electronic landscape...

PBEsol+U+SOC+3k

FCC $[\text{Fm}\bar{3}\text{m} (225)]$ AFM 3k stable phase [1]
→ Same as in UO_2 , about 1eV/F.U. difference with diamagnetic structure

Computational details

Pu ($5f^5 6s^2 6p^6 6d^1 7s^2$); O ($1s^2 2s^2 2p^2$)

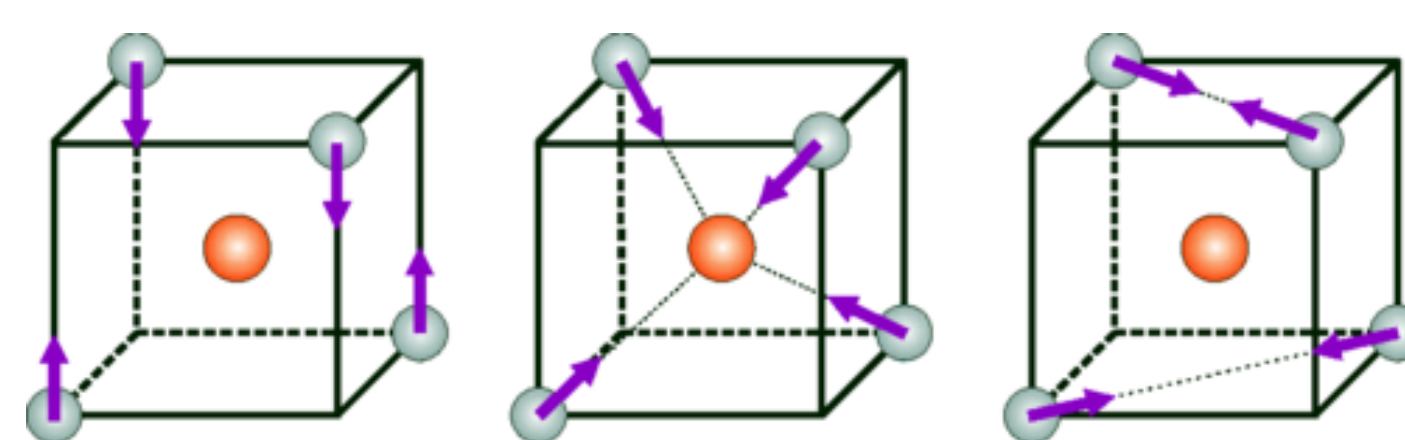
Lichtenstein scheme, $E_{\text{cut}} = 600\text{eV}$, $2^3/4^3$ k-points
AFM 3k initial magnetic state with $4\mu_B$ per Pu atom

	ABINIT	VASP
Version	10.0.9	6.4.3
Convergence	TOLVRS= 10^{-1}	DIFFE= 10^{-4}

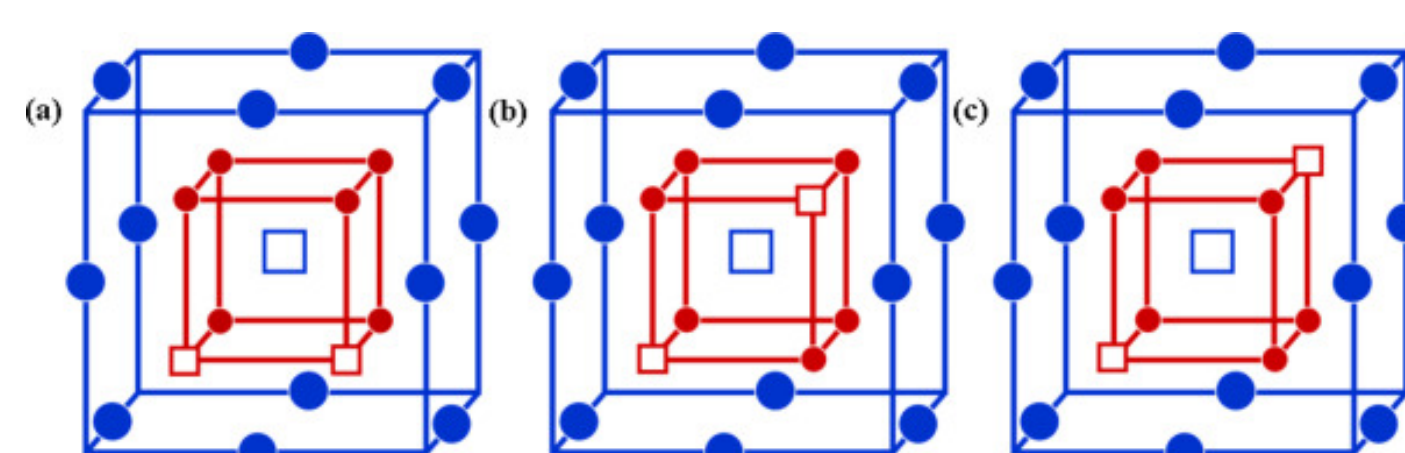
Benchmark on $(\text{U}, \text{Pu})\text{O}_2$ system

ABINIT: 1500h CPUs
VASP: 157h CPUs for DIFFE= 3×10^{-5}

560 MPI/no OMP
112 MPI/no OMP



Dudarev *et al.* Parametrization of LSDA+U for noncollinear magnetic configurations: Multipolar magnetism in UO_2 . *Phys.Rev.Mater.*, 2019

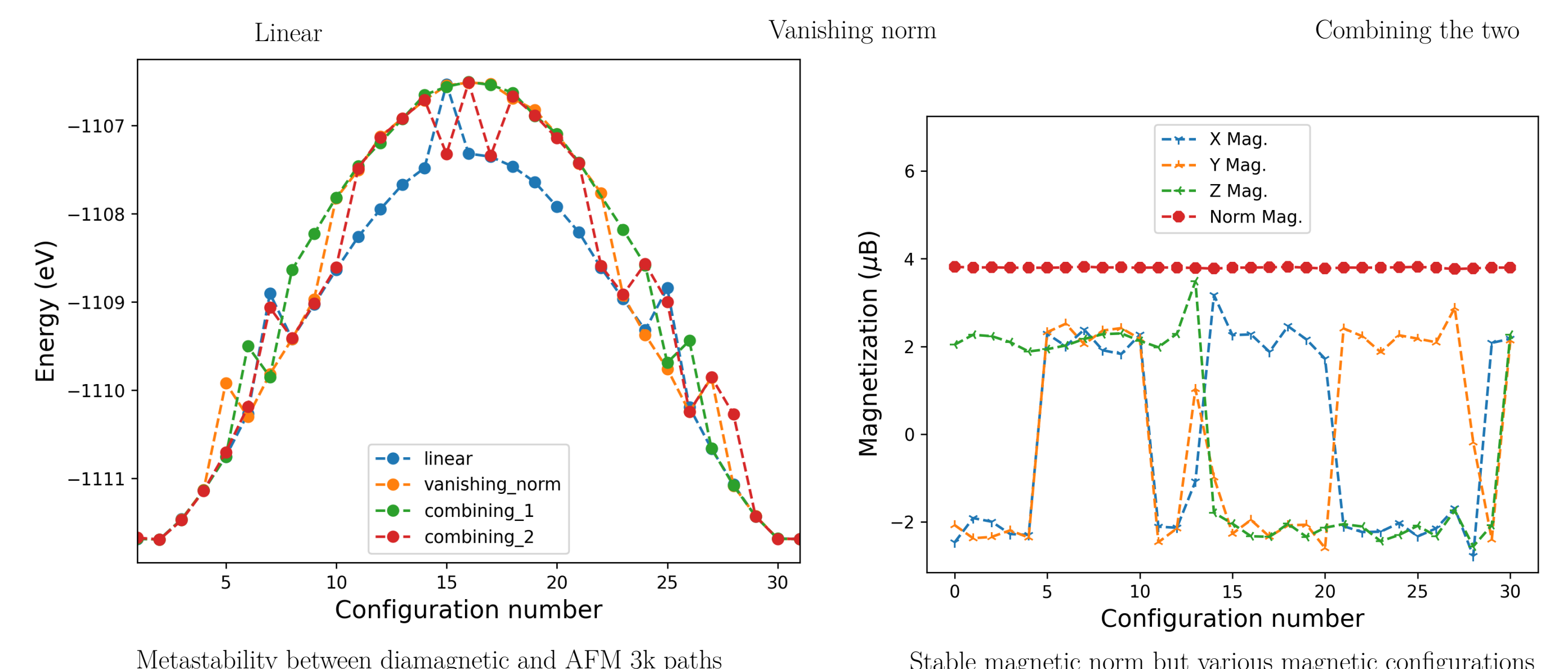
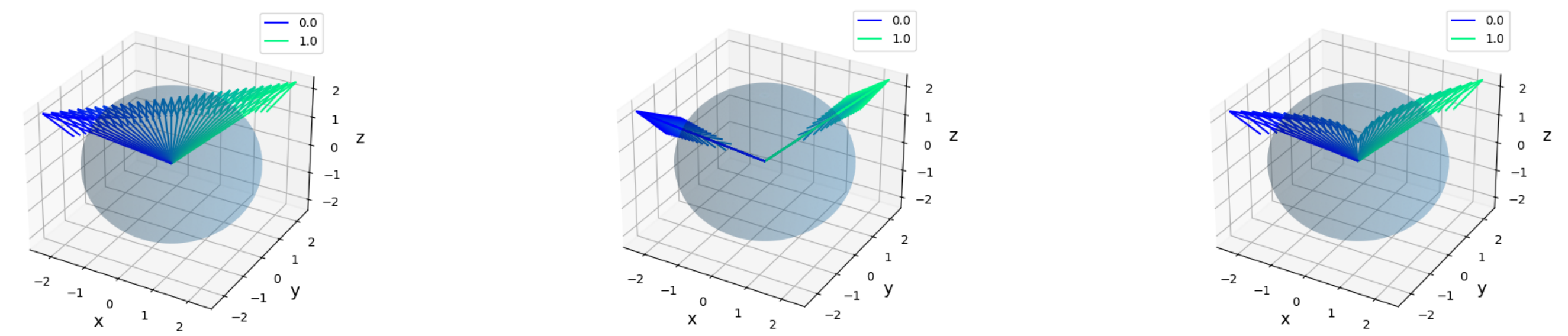


Bounded Schottky Defects of types 1/2/3

Singh *et al.* A first principles investigation of defect energetics and diffusion in actinide dioxides. *Journal of Nuclear Materials*, 2024

BSD3 defect NEB

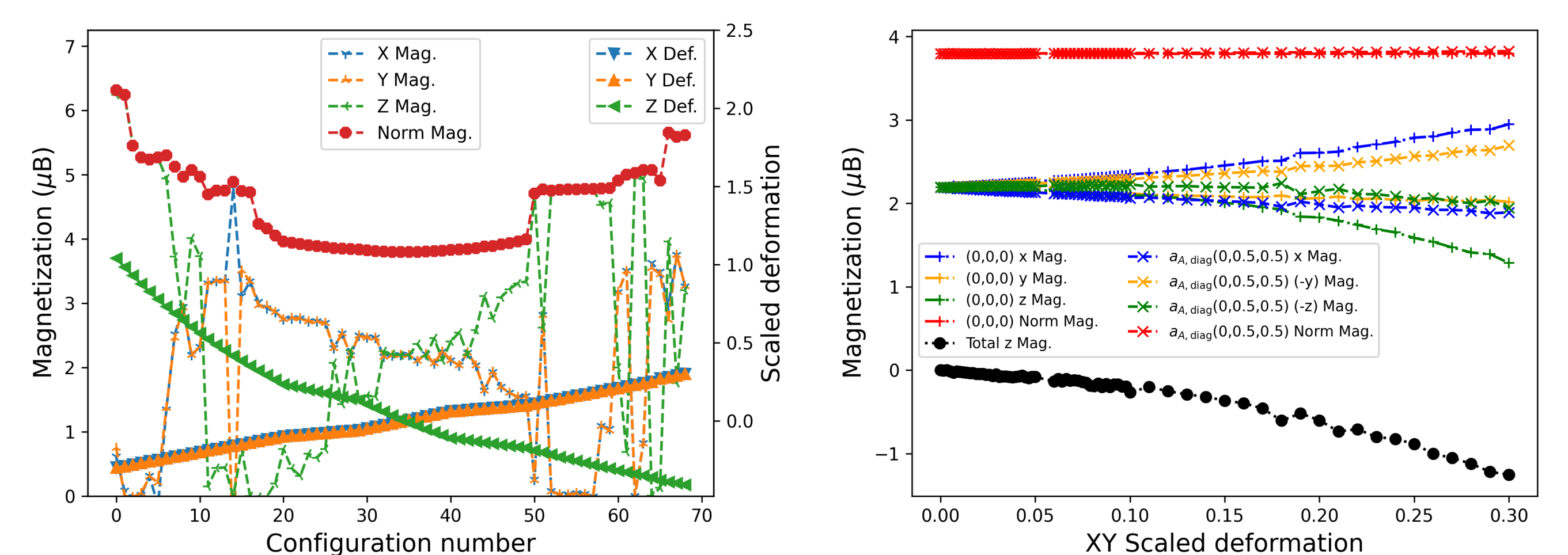
Predict the impact of **defect migrations**: diffusion path of one Pu atom between stable fcc sites (magnetism change between --+ and +++)



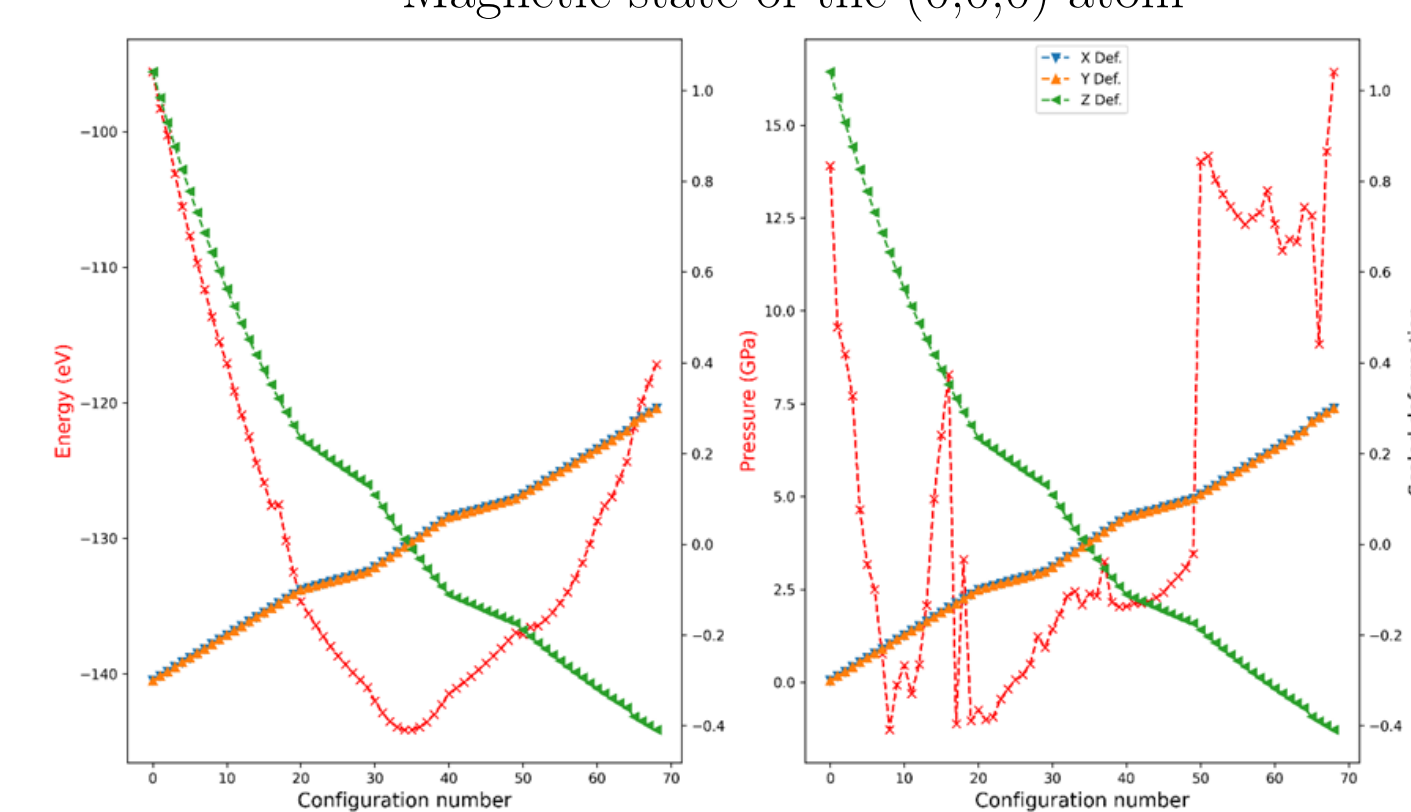
Metastability between diamagnetic and AFM 3k paths

Stable magnetic norm but various magnetic configurations

Elasticity



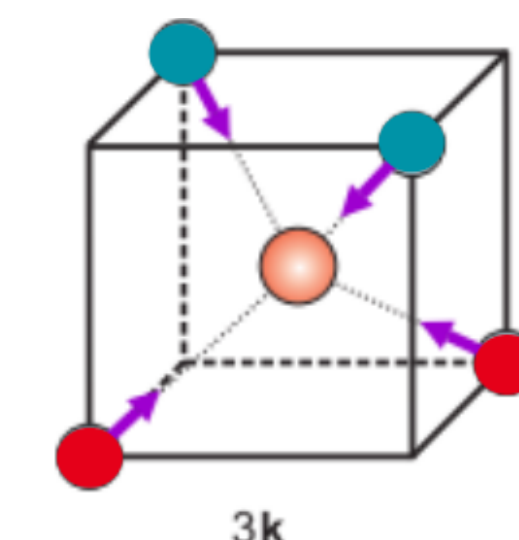
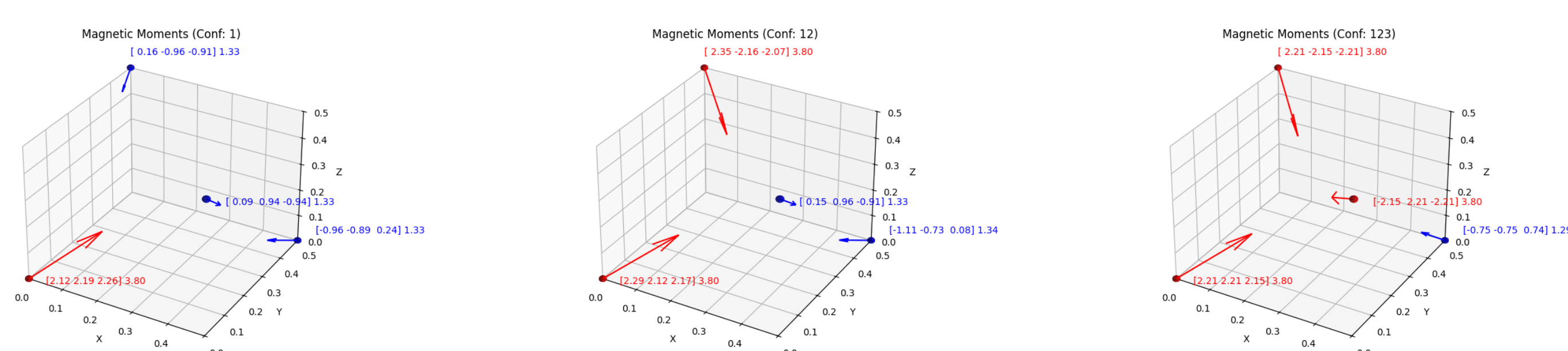
Magnetic state of the (0,0,0) atom



Jump of observable values matching magnetic transitions

Spontaneous magnetization

Coupling of magnetic components between **blue** and **red** Pu pairs

 $(\text{U}, \text{Pu})\text{O}_2$ systems

3k for **Pu**, 2k for **U** or 3k with small magnetic norm

Conclusion and perspectives

- Lack of experimental data
- DFT setup is complex and computations are costly, convergence is difficult
- Magnetic state changes with deformations: need to extract homogeneous data for the MLIP training

Mixed oxides are even harder

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- Dorado *et al.* DFT + U calculations of the ground state and metastable states of uranium dioxide. *Phys. Rev. B*, 2009
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- Candela *et al.* Magnetic susceptibilities of uranium (IV) and plutonium (IV) ions in cubic fields. *The Journal of Chemical Physics*, 1959
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- Dudarev *et al.* Parametrization of LSDA + U for noncollinear magnetic configurations: Multipolar magnetism in UO_2 . *Phys. Rev. Mater.*, 2019