

# mamonca: magnetic Monte Carlo code

**Osamu Waseda**  $\bullet^{1^* \P}$ **, Tilmann Hickel**  $\bullet^{1^*}$ **, and Jörg Neugebauer**  $\bullet^{1}$ 

**1** Max-Planck-Institut für Eisenforschung, Max-Planck-Straße 1, D-40237 Düsseldorf, Germany ¶ Corresponding author **\*** These authors contributed equally.

## **Summary**

Magnetic interactions account for a significant portion of free energy in certain materials, ranging from relatively simple systems such as iron to complex magneto-caloric effects of Heusler alloys [\(Weiss & Piccard, 1917\)](#page-2-0). More specifically, in the case of iron, the ground state would be wrongly predicted without considering magnetic interactions [\(Friák et al., 2001\)](#page-1-0). In Heusler systems, the understanding of magnetic properties could allow for the development of highly efficient refrigeration systems. In materials science, the Heisenberg model is frequently employed to heuristically compute the magnetic part of the potential energy. There are two main methods to make use of the Heisenberg model at finite temperature: one is the Monte Carlo method for an efficient free energy minimization, the other is spin dynamics for the calculation of spin configuration evolution. The Monte Carlo method has the advantage of obtaining the free energy rapidly, while spin dynamics also delivers the kinetics of the system. mamonca allows for the evaluation of the Heisenberg Hamiltonian with extended terms using both Monte Carlo method and spin dynamics.

## **Model**

mamonca is based on the Heisenberg Landau model of the format:

$$
\mathcal{H}=-\frac{1}{2}\sum_{ij,\kappa}J_{ij,\kappa}m_i^{2\kappa+1}m_j^{2\kappa+1}+\sum_{i,\kappa}A_{i,\kappa}m_i^{2\kappa}
$$

where i and j go over all atoms and  $\kappa$  is the exponent ( $\kappa = 1$  and  $A_{i,\kappa} = 0$  for all i and  $\kappa$ for the classical Heisenberg model) and  $m^{\phantom{\dag}}_i$  is the magnetic moment of the atom  $i.$  These parameters can be set independently via mamonca.set\_landau\_parameters for the longitudinal parameters  $A_{i,\kappa}$  and mamonca.set\_heisenberg\_parameters for the Heisenberg parameters  $Jij, \kappa$ . The evaluation takes place either via Metropolis Monte Carlo method or spin dynamics. More technical details and simple examples are given in notebooks/first\_steps.ipynb.

## **Statement of need**

mamonca is a C++-based python software package for the computation of magnetic interactions in solid materials. Its interactive and modular nature makes it for a user who wants to obtain the magnetic behavior of simple to complex systems as well as combining it with other tools on the fly. All inputs and outputs are given by setters (starting with set\_) and getters (starting with get\_), in order for mamonca to spare file-reading and writing, in strong contrast to other existing software packages [\(Bauer et al., 2011;](#page-1-1) [Evans et al., 2014;](#page-1-2) [Hellsvik et al., 2011;](#page-1-3) [Kawamura](#page-2-1) [et al., 2017](#page-2-1)). As a result, it has excellent interactivity, as the parameters can be changed on the fly, as well as the outputs can be retrieved at any interval chosen by the user. With

#### **DOI:** [10.21105/joss.06194](https://doi.org/10.21105/joss.06194)

#### **Software**

- [Review](https://github.com/openjournals/joss-reviews/issues/6194) C
- [Repository](https://github.com/samwaseda/mamonca) C
- [Archive](https://doi.org/10.5281/zenodo.13309692)

Editor: [Kelly Rowland](https://nersc.gov/kelly-rowland) C<sup>O</sup> **Reviewers:**

- [@arjunsavel](https://github.com/arjunsavel)
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**Submitted:** 10 November 2023 **Published:** 15 August 2024

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mamonca, the user can analyse any structure that can be defined by other software packages such as Atomic Structure Environment (ASE) [\(Larsen et al., 2017\)](#page-2-2) or pyiron [\(Janssen et al.,](#page-2-3) [2019](#page-2-3)), as mamonca takes only the exchange parameters and does not require the knowledge of the structure, which is a strong contrast to existing software packages [\(Bauer et al., 2011;](#page-1-1) [Kawamura et al., 2017\)](#page-2-1). mamonca has also high flexibility in defining the Hamiltonian, as it allows the user to define not only the classical Heisenberg model, but higher order components including the longitudinal variation, as it has been employed for Fe-Mn systems [\(Schneider et al.,](#page-2-4) [2021](#page-2-4)). In order to validate the code, a comparison of results produced with mamonca with those obtained in [\(Schneider et al., 2021\)](#page-2-4) is given in the notebook notebooks/first\_steps.ipynb. The input parameters for the Hamiltonian can be straightforwardly obtained using a workflow tool such as pyiron, or other calculation software packages such as TB2J [\(He et al., 2021\)](#page-1-4). A typical workflow with pyiron would consist of a general set of physical parameters (chemical element, lattice parameter etc.), is given in the notebook notebooks/first\_steps.ipynb, which is then evaluated by the software of user's choice. The results can be straightforwardly evaluated to obtain the exchange parameters with the existing tools inside pyiron. Finally, mamonca can run to deliver the finite temperature effects of the magnetic part. A full workflow example including the acquisition of magnetic interaction parameters is given in the notebook notebooks/fitting.ipynb. This means, the user in principle needs only to insert physical parameters to obtain the magnetic finite temperature behaviour they are interested in. In addition to the classical Monte Carlo and spin-dynamics, mamonca allows also for an addition of Metadynamics [\(Theodoropoulos et al., 2000\)](#page-2-5) and magnetic thermodynamic integration (Chap. 9 [\(Frenkel & Smit, 2023\)](#page-1-5)), which can deliver the free energy variation. It is crucial to include these features within the code, as they have to be applied at each step of the simulation and cannot be evaluated in the post-processing. To authors' knowledge, it is the only one code that is able to run Monte Carlo calculations with Metadynamics and magnetic thermodynamic integration. Both thermodynamic integration and Metadynamics are shown in the notebook notebooks/first\_steps.ipynb for simple systems.

# **Acknowledgements**

We gratefully acknowledge the financial support from the German Research Foundation (DFG) under grant HI 1300/15-1 within the DFG-ANR project C-TRAM.

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