Combining DFT and CALPHAD for the development of on-lattice interaction models: The case of Fe-Ni system

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We present a model of pair interactions on rigid lattice to study the thermodynamic properties of iron-nickel alloys. The pair interactions are fitted at 0 K on *ab initio* calculations of formation enthalpies of ordered and disordered (special quasirandom) structures. They are also systematically fitted on the Gibbs free energy of the γ Fe-Ni solid solution as described in a CALPHAD (CALculation of PHAse Diagrams) study by Cacciamani *et al.* This allows the effects of finite temperature, especially those of magnetic transitions, to be accurately described. We show that the *ab initio* and CALPHAD data for the γ solid solution and for the FeNi3-L12 ordered phase can be well reproduced, in a large domain of composition and temperature, using first and second neighbor pair interactions which depend on temperature and local alloy composition. The procedure makes it possible to distinguish and separately compare magnetic, chemical, and configuration enthalpies and entropies. We discuss the remaining differences between the pair interaction model and CALPHAD, which are mainly due to the treatment of the short-range order and configurational entropy of the solid solution. The FCC phase diagram of the Fe-Ni system is determined by Monte Carlo simulations in the semigrand canonical ensemble and is compared with experimental studies and other models. We especially discuss the stability of the $FeNi-L1₀$ phase at low temperature.

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I. INTRODUCTION

Atomistic Monte Carlo simulations of phase transformation kinetics in metallic alloys (precipitation, ordering, etc. $[1–13]$) require interaction models that allow a precise description of the thermodynamic and kinetic properties of the materials, while remaining simple enough to model systems of a few million atoms over long periods of time (their evolution being controlled by thermally activated diffusion mechanisms). Models using effective interactions on rigid lattices—although limited to coherent problems—are among the most widely used and have become more reliable since they are systematically fitted to *ab initio* calculations of materials properties at 0 K (such as the formation energies of ordered phases or special quasirandom structures, point defect formation and migration energies, etc.) [\[5,7,13\]](#page-10-0).

Evaluating nonzero temperature effects from *ab initio* methods is more difficult: calculations of vibration entropy, for example, are in principle possible but are computationally expensive and are usually limited to simple systems (e.g., pure metals, perfectly ordered phases, or dilute alloys). Modeling the effect of magnetic transitions and magnetic

disorder—especially important in iron based alloys—is also very challenging. Alternatively, the temperature dependence of pair interactions can be adjusted on experimental data, for example on phase diagrams, but these adjustments are often made on a case-by-case basis. We propose here a new approach to systematically fit a pair interaction model both on *ab initio* calculations at 0 K and, for high temperatures, on a CALPHAD-type model. CALPHAD models provide an accurate description of the Gibbs free energies of the different phases of an alloy, based on empirical thermodynamic models fitted (mainly) on large numbers of experimental measurements. They also provide a specific description of some important contributions (e.g., magnetic contributions in ironbased alloys). The objective of this paper is to show how to establish a term-to-term correspondence between the empirical models used in CALPHAD and the effective interactions of a lattice model, to show the improvements that this brings to the description of a particular alloy, but also to discuss the limits of such a correspondence.

We apply this approach to Fe-Ni alloys with a facecentered cubic structure (FCC). Recent *ab initio* [\[16,17\]](#page-11-0) and CALPHAD [\[18,19\]](#page-11-0) studies are available for this system. The thermodynamic properties of Fe-Ni alloys have been much studied, because of their industrial interest and because they still raise unresolved questions. The phase diagram of the Fe-Ni system (Fig. [1\)](#page-1-0) is well known at temperatures above 400 °C [\[20\]](#page-11-0): The FCC solid solution γ is stable over the whole composition range and over a wide temperature range.

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FIG. 1. The phase diagram of the Fe-Ni system (from Refs. [\[14,15\]](#page-11-0)).

The body centered cubic (BCC) solid solution α is stable below 912 ℃ and only with nickel contents below approximately 10%. A two-phase domain $\alpha - \gamma$ is observed in iron-rich alloys, and an ordered FeNi₃ phase (with the $L1_2$) structure) is formed below 516 ◦C.

At lower temperatures, the phase diagram is—as usual more difficult to establish, because of slow diffusion processes. However, irradiation experiments [\[21–23\]](#page-11-0), observations of meteorites [\[15,24\]](#page-11-0), and *ab initio* studies [\[16,17\]](#page-11-0) suggest that other ordered FCC phases may be stable or metastable (notably the FeNi phase of $L1_0$ structure and the Fe₃Ni phase of $L1_2$ structure). Many CALPHAD studies have sought to complement the Fe-Ni phase diagram by extrapolating at low temperatures the empirical thermodynamic models fitted to experiments at high temperatures. This is especially difficult in the case of Fe-Ni, and as a result, the proposed phase diagrams show significant differences [\[15,18,20,25\]](#page-11-0). A particular difficulty of this system is that the experimental data are obtained essentially in paramagnetic phases, whereas the ordered phases are ferromagnetic. Magnetic contributions are indeed taken into account in CALPHAD approaches, but again by empirical models using experimental data and still under discussion [\[25\]](#page-11-0).

Atomistic models combining the information from experiments and first principle methods may provide additional insight on these issues. A few rigid lattice interaction models, fitted to *ab initio* calculations, have been developed for Fe-Ni alloys: Mohri *et al.* [\[26\]](#page-11-0) proposed a cluster expansion to study the stability of the ordered compound $FeNi-L1₀$ in the framework of a CVM approximation: They found an ordering temperature of 483 K (taking into account the vibration entropy, which lowers it by about 40 K). But they did not study the FeNi₃ phase, nor the effect of the ferro-to-paramagnetic transition. Effective interactions models including an explicit description of the magnetic moments have been proposed for Fe-Ni alloys, using Ising [\[27–30\]](#page-11-0) or Heisenberg [\[30,31\]](#page-11-0) models for the magnetic interactions and parameters fitted to the experimental transition temperatures. Similar magnetic models have been also used in phase-field simulations of ordering and precipitation of the FeNi₃ phase $[32]$. More recently Lavrentiev, Wrobel *et al.* [\[33,34\]](#page-11-0) developed a magnetic cluster expansion (MCE), based on a Heisenberg-Landau Hamiltonian, fitted to *ab initio* calculations. Its properties have been studied by Monte Carlo methods, but the combined equilibration of the chemical and magnetic configurations is very costly in computational time, and the complete phase diagram of the MCE model of Fe-Ni remains to be established.

In the present paper, we propose a pair interaction model (PIM) based on a rigid lattice approximation, aimed at modeling the Fe-Ni system. The model does not describe explicitly the magnetic moments, nor the lattice relaxations, which makes it faster to process in Monte Carlo simulations. It only involves pair interactions between atoms that depends both on the local composition and temperature. Finite temperature effects of magnetic transitions or of lattice vibrations (harmonic and nonharmonic) on the energetic proprieties are taken into account through these dependencies.

The outline of this paper is as follows: Section II is devoted to the thermodynamic models of FCC phases in the Fe-Ni system. We briefly recall the Gibbs free energy models used in the CALPHAD approaches, focusing on the recent study of Cacciamani *et al.* [\[18\]](#page-11-0) (Sec. II A) then the available *ab initio* results on the properties of Fe-Ni alloys (in particular those of K. Li and C.-C. Fu $[17]$) (Sec. [II B\)](#page-2-0). We then show how to reproduce these results with the PIM in Sec. [II C.](#page-3-0) In Sec. [III,](#page-5-0) we use Monte Carlo simulations in the semicanonical grand ensemble to measure the Gibbs free energies of the FCC alloys and to build the FCC phase diagram.

II. THERMODYNAMIC MODELS

Our PIM is built using both a CALPHAD study and *ab initio* calculations. We therefore recall the main information provided by these two approaches before to explain how it can be reproduced with effective interactions on a rigid lattice.

A. CALPHAD models

Several CALPHAD-type studies have been proposed for the Fe-Ni system: The most recent are those of Cacciamani *et al.* [\[18\]](#page-11-0) and Ohnuma *et al.* [\[19\]](#page-11-0) (for older ones, see the reviews in Refs. [\[15,20\]](#page-11-0)). Within the CALPHAD framework, a Gibbs free energy model can be defined for each of the phases to be considered (e.g., in the Fe-Ni system, the α and γ solid solutions and the different ordered phases). This gives great flexibility to fit the parameters to the experimental data. We will fit our PIM parameters to the study by Cacciamani *et al.* [\[18\]](#page-11-0) (which will be hereafter simply referred to as the "CALPHAD model" or even as "CALPHAD"), but the following presentation and procedure could easily be adapted to other CALPHAD studies.

1. The γ solid solution

The Gibbs free energy per atom of the solid solution γ (FCC) Fe1−*^x*Ni*^x* is:

$$
G^{\gamma} = G_{\text{ref}}^{\gamma} + G_{\text{ex}}^{\gamma} + G_{\text{mag}}^{\gamma} + G_{\text{id}}^{\gamma}.
$$
 (1)

This is the total Gibbs free energy, including the entropy of configuration. (Note that in CALPHAD one rather uses molar energies, in J mol⁻¹. We convert them in energies per atom, in eV).

 G_{ref}^{γ} is the nonmagnetic contribution of pure metals:

$$
G_{\text{ref}}^{\gamma} = (1 - x)G_{\text{Fe}}^{\gamma} - xG_{\text{Ni}}^{\gamma},\tag{2}
$$

where G_{Fe}^{γ} and G_{Ni}^{γ} are the Gibbs free energy of pure Fe and pure Ni. G_{ex}^{γ} is the excess Gibbs free energy, written as a sum of Redlich-Kister polynomials:

$$
G_{\text{ex}}^{\gamma} = x(1-x) \sum_{i} L_{i}^{\gamma} (T)(1-2x)^{i}
$$
 (3)

(from $i = 0$ to 2 in Ref. [\[18\]](#page-11-0)).

 G_{mag}^{γ} is the magnetic contribution:

$$
G_{\text{mag}}^{\gamma} = -k_B T f(\tau) \ln(\beta(x) + 1) \tag{4}
$$

 $\tau = T/T_c(x)$, where $T_c(x)$ is the Curie temperature, $\beta(x)$ the average magnetic moment of the γ solid solution, and $f(\tau)$ is a polynomial function of the reduced temperature. $T_c(x)$ and $\beta(x)$ are also given by Redlich-Kister polynomials of the composition *x*, fitted to experimental measurements. Different expressions and values have been proposed [\[25\]](#page-11-0); those used by Cacciamani *et al.* are given in Ref. [\[18\]](#page-11-0).

 G'_{id} corresponds to an ideal entropy of configuration:

$$
G_{\rm id}^{\gamma} = -TS_{\rm id}^{\gamma} = k_B T [x \ln x + (1 - x) \ln(1 - x)], \quad (5)
$$

i.e., to the configuration entropy of a perfectly disordered solid solution with no short-range order. Note that the excess term [Eq. (3)] may include a nonideal configurational part, but it is not identified as such. Finally, the Gibbs free energy of mixing is:

$$
G_{\text{mix}}^{\gamma} = G^{\gamma} - (1 - x)G_{\text{Fe}}^{\gamma} - xG_{\text{Ni}}^{\gamma},\tag{6}
$$

where $G_{\text{Fe}}^{\gamma} = G_{\text{Fe}}^{\gamma} + G_{\text{mag}}^{\gamma}(x = 0)$ and $G_{\text{Ni}}^{\gamma} = G_{\text{Ni}}^{\gamma} + G_{\text{mag}}^{\gamma}(x = 0)$ 1) are the total Gibbs free energies of the pure metals, including the magnetic part.

2. Ordered phases

In the study by Cacciamani *et al.* [\[18\]](#page-11-0), the ordered phases FeNi₃ (L1₂), Fe₃Ni (L1₂), and FeNi (L1₀) are modeled within the framework of the Compound energy formalism (CEF) with four sublattices. An additional term is added to the Gibbs free energy of the γ phase, which depends on the distribution of species on the different sublattices and on interaction energies (limited to the first nearest neighbors) fitted to *ab initio* calculations of the formation enthalpy of the perfectly ordered phase. In the present work, we will use more detailed *ab initio* studies, involving both ordered and disordered configurations and summarized in the following section.

B. *Ab initio* **calculations**

1. Density functional theory method

In this work, the 0 K formation enthalpies of Fe-Ni ordered and disordered phases are fitted to those computed in the *ab initio* study of Ref. [\[17\]](#page-11-0). The essential computational points are presented in the following.

TABLE I. Formation enthalpies of FCC ordered phases in Fe-Ni (DFT calculations from Ref. [\[17\]](#page-11-0)).

Ordered phase	H_{for} (eV/atom)
$Fe7Ni-cI32$	0.039273
$Fe3Ni-L1$	-0.01636
$Fe3Ni-Z1$	-0.04414
$Fe2Ni-Cl1f$	-0.06991
$FeNi-L1_1$	-0.04040
$FeNi-L10$	-0.10797
$Fe2Ni-Cl1f$	-0.08064
$FeNi2-Li2$	-0.10879
$FeNi7-cI32$	-0.04541

The *ab initio* calculations were performed using density functional theory (DFT) with the projector augmented wave method [\[35,36\]](#page-11-0) as implemented in the VASP (Vienna *ab initio* simulation package) [\[37–39\]](#page-11-0). The generalized gradient approximation for the exchange-correlation functional in the Perdew-Burke-Ernzerhof parametrization [\[40\]](#page-11-0) was employed. All the calculations are spin polarized. 3*d* and 4*s* electrons were considered as valence electrons. The plane-wave basis cutoff was set to 400 eV. The Methfessel-Paxton broadening scheme with a smearing width of 0.1 eV was used [\[41\]](#page-11-0). The *k*point grids were generated according to the cell size to achieve a *k*-sampling equivalent to a cubic unit cell with a $16 \times 16 \times$ 16 shifted grid following the Monkhorst-Pack scheme [\[42\]](#page-11-0). The zero-point energies, which can be significant for light elements, have been calculated in the ordered phases. Their contribution to the mixing enthalpies is very small (typically 0.001 to 0.003 eV) and has been neglected in the following. FCC solid solutions were represented by special quasirandom structures (SQS) [\[43\]](#page-11-0) minimizing Warren-Cowley short-range order parameters [\[44,45\]](#page-11-0), with 128-atom and 108-atom supercells for antiferromagnetic-double-layer and ferromagnetic phases, respectively.

2. Ordered phases

The formation enthalpies of nine ordered structures on the FCC lattice, calculated by Kangming *et al.* [\[17\]](#page-11-0) using the DFT method presented in the previous section, are given in Table I and Fig. [2.](#page-3-0) The ordered structures are ferromagnetic, except for $Fe₇Ni-cI32$ which is ferrimagnetic. The formation enthalpies are defined with the antiferromagnetic FCC iron and the ferromagnetic FCC nickel as reference states. The trends are the same as in a previous study by Mishin *et al.* [\[16\]](#page-11-0): Only the FeNi-L1₀ and FeNi₃-L1₂ phases are located on the convex hull (Fig. [2\)](#page-3-0) and must therefore be stable at low temperature on the FCC lattice. However the $FeNi₇-cI32$ and $Fe₂Ni-Cl1_f$ phases are close to the stability limit.

3. Special quasirandom structures

The formation enthalpies H_{for} of special quasirandom structures (SQS) of different compositions have also been calculated in the same study with different magnetic states. These structures are representative of random solid solutions. They were generated by standard methods, with a minimization of Warren-Cowley short-range order parameters. They

FIG. 2. Formations enthalpies of ordered FCC structures at 0 K (DFT calculations from Ref. [\[17\]](#page-11-0)).

are described in Ref. [\[17\]](#page-11-0), with a detailed analysis of their volume and magnetic moments. We just recall here the energetic results used for the PIM parametrization.

The most stable SQS are found to be double-layered antiferromagnetic for $x < 0.184$ and ferromagnetic for $x > 0.184$ (red circles in Fig. 3). One observes an asymmetrical evolution of H_{for} with the composition, as already predicted in the study by Cacciamani *et al.*, with mainly negative values (i.e., a tendency to order) and a minimum in the vicinity of the composition of the FeNi₃ phase. However, the SOS values are significantly larger than the CALPHAD ones (Fig. 3) and are even slightly positive for $x < 0.20$ (as already obtained by Sansa *et al.* [\[46\]](#page-11-0), using a tight-binding approach).

C. Pair interaction model

We propose to reproduce the properties of Fe-Ni alloys with a model of concentration- and temperature-dependent pair interactions on a perfect FCC lattice. This pair interaction model (PIM) is based on a similar one developed for Monte Carlo simulations of BCC Fe-Cr alloys [\[9](#page-10-0)[,47\]](#page-11-0), which had however not been fitted systematically on a CALPHAD model and did not explicitly distinguish a magnetic contribution.

The essential assumption of the PIM is that the Gibbs free energy (per atom) of a given configuration, i.e., a given

FIG. 3. Formations enthalpies at 0 K of quasirandom FCC structures (DFT calculations [\[17\]](#page-11-0)) and FCC solid solutions (CALPHAD [\[18\]](#page-11-0), with separate magnetic and excess contributions).

distribution of n_{Fe} Fe atoms and n_{Ni} Ni atoms ($N = n_{Fe} + n_{Ni}$) on the FCC lattice, can be written as a sum of interactions $g_{ij}^{(n)}(x, T)$ between pairs of *i* and *j* atoms on *n*th neighboring sites:

$$
G_{\text{conf}} = \frac{1}{N} \sum_{ij} g_{ij}^{(n)}(x, T). \tag{7}
$$

The pair interactions depend on the temperature *T* and the Ni concentration x (we will omit these dependencies in the following to simplify the notations). The dependence on concentration is required to reproduce an asymmetric evolution of formation enthalpies, as observed in Figs. 2 and 3. The dependence on temperature describes the entropic contributions (electronic, vibrational, and magnetic) other than the configuration entropy, so the $g_{ij}^{(n)}$ are indeed "pair Gibbs free energies" and can be written as $g_{ij}^{(n)} = h_{ij}^{(n)} - Ts_{ij}^{(n)}$ [\[48\]](#page-11-0).

To facilitate the comparison with CALPHAD models, each interaction $g_{ij}^{(n)}$ is written as a sum of a nonmagnetic (nm) and a magnetic term (mag). G_{conf} is therefore the sum of

$$
G_{\rm conf}^{\rm nm} = \frac{1}{N} \sum_{ij} g_{ij}^{\rm nm(n)} \tag{8}
$$

which accounts for the chemical and vibrational contributions, and of

$$
G_{\text{conf}}^{\text{mag}} = \frac{1}{N} \sum_{ij} g_{ij}^{\text{mag}(n)}.
$$
 (9)

The total Gibbs free energy of the alloy is

$$
G = G_{\text{conf}} - TS_{\text{conf}},\tag{10}
$$

where S_{conf} is the entropy of configuration, which will be evaluated from Monte Carlo simulations. The Gibbs free energy of mixing *G*mix is

$$
G_{\text{mix}} = G - (1 - x)G'_{\text{Fe}} - xG'_{\text{Ni}}.
$$
 (11)

G Fe is the Gibbs free energy of pure iron, on the same FCC lattice:

$$
G'_{\text{Fe}} = G_{\text{Fe}}^{\text{nm}} + G_{\text{Fe}}^{\text{mag}} \tag{12}
$$

$$
= \sum_{n} \frac{z_n}{2} \left(g_{\text{FeFe}}^{\text{nm}(n)} + g_{\text{FeFe}}^{\text{mag}(n)} \right) \tag{13}
$$

$$
=\sum_{n}\frac{z_n}{2}g_{\text{FeFe}}^{(n)},\tag{14}
$$

where z_n is the coordination number for the nearest neighbors *n*. The same expressions apply to pure nickel.

1. High temperatures: Fitting of the pair interactions to CALPHAD

In the PIM, the Gibbs free energy of mixing of a perfectly disordered solid solution is

$$
G_{\text{mix}}(x, T) = x(1 - x) \sum_{n} v_n(x, T) - TS_{\text{id}}, \qquad (15)
$$

where the ordering parameters v_n are defined as

$$
v_n(x,T) = g_{\text{FeNi}}^{(n)} - \frac{1}{2} \left(g_{\text{FeFe}}^{(n)} + g_{\text{NiNi}}^{(n)} \right). \tag{16}
$$

FIG. 4. Formations enthalpies of quasirandom FCC structures at 0 K: *ab initio* calculations (DFT) and pair interaction model (PIM, with the excess and magnetic contributions). The formations enthalpy of the γ solid solution of CALPHAD is also shown for comparison.

To reproduce the properties of the CALPHAD model, we identify the nonmagnetic part of the ordering parameters [in Eq. (15)] to the excess Gibbs free energy of CALPHAD [Eq. [\(3\)](#page-2-0)]:

$$
\sum_{n} v_n^{\text{nm}}(x, T) = \frac{G_{\text{ex}}^{\gamma}}{x(1 - x)}
$$
(17)

and their magnetic part to the magnetic Gibbs free energy of CALPHAD $[Eq. (4)]$ $[Eq. (4)]$ $[Eq. (4)]$:

$$
\sum_{n} v_n^{\text{mag}}(x, T) = \frac{G_{\text{mag}}^{\gamma}}{x(1 - x)}.
$$
 (18)

The fitting of the PIM parameters on CALPHAD can be summarized to the equations (16) – (18) . It is worth noticing that it is based on an approximation: Equation (15) is exact only for a disordered solid solution, i.e., at sufficiently high temperatures. In the real solid solution, a short-range order may exist, and the configuration entropy does not reduce to an ideal term.

2. Low temperatures: Fitting of the pair interactions to ab initio calculations

To reproduce the properties of a solid solution at 0 K, the same method can be used by fitting $v_n(x, T)$ on the formation enthalpies of SQS calculated by DFT. The magnetic part remains fitted to the magnetic model of CALPHAD [Eq. (18)] and the nonmagnetic part is fitted so that the sum of the magnetic and nonmagnetic contributions of the PIM reproduces the DFT formation enthalpies. A good agreement is obtained with a Redlich-Kister polynomial of order 5 (instead of 2 for G_{ex}^{γ} in Ref. [\[18\]](#page-11-0)), as shown in Fig. 4 (with, respectively, the magnetic part, the nonmagnetic part, and the total mixing enthalpies of the PIM). The fitting coefficients L_j^{DFT} of the polynomial are given in Table II, corresponding to the orange curve in Fig. 4. As mentioned above, this gives mixing enthalpies above those predicted by CALPHAD at 0 K.

This fit of pair interactions [using Eq. (15)] to the CAL-PHAD model or to the formation enthalpies of SQS, only involves the sum of *vⁿ* and can be done with any range *n* of

TABLE II. The coefficients L_j^{DFT} of the Redlich-Kister polynomial for the excess enthalpy of mixing of the γ solid solution of the PIM (in eV).

$L_0^{\rm DFT}$	$L^{\rm DFT}$	$L_{\rm 2}^{\rm DFT}$	$L_{\rm 2}^{\rm DFT}$	$L_{\rm A}^{\rm DFT}$	$L_{\epsilon}^{\rm DFT}$
				-0.03696 0.09631 -0.04722 0.21141 -0.04752 -0.18389	

interactions. However, it is well known that in FCC ordered structures, the phase diagram and in particular the orderdisorder temperatures, depend strongly on the ratio $= v_2/v_1$ [\[49\]](#page-11-0). The fit is also independent of the choice of the composition x (local or global) in Eqs. (17) and (18) . Therefore, it does not provide a very accurate description of the interatomic interactions in Fe-Ni alloys.

To get a better description of the thermodynamic properties, the range of interactions and the ratio between the interactions at different distances is fitted to the DFT calculations of the formation enthalpies of the ordered phases (Table [I\)](#page-2-0). With only first nearest neighbors (nn) interactions [Fig. $5(a)$], the PIM model underestimates the formation enthalpies of the ordered phases, especially those of the FeNi-L 1_0 and FeNi₃-L 1_2 phases.

FIG. 5. Formations enthalpies of FCC ordered phases at 0 K: *ab initio* calculations (DFT, full circles) and pair interaction model (PIM, open circles) with (a) only first nn interactions, (b) first and second nn interactions, $\alpha = v_2/v_1 = -0.7$.

TABLE III. Formation enthalpies of FCC ordered phases in a pair interaction model with first and second nearest neighbor interactions.

Ordered phases	x_1	x_2	$H_{\mathrm{for}}^{\mathrm{PIM}}$
$Fe7Ni-cI32$	$\frac{1}{34}$	$\frac{5}{34}$	$\frac{3}{2}v_1 + \frac{3}{4}v_2$
$Fe3Ni-L12$	$\frac{9}{34}$	0	$3v_1$
$Fe3Ni-Z1$	$\frac{11}{34}$	$\frac{9}{34}$	$2v_1 + \frac{1}{2}v_2$
$Fe2Ni-Cl1f$	$\frac{6}{17}$	$\frac{6}{17}$	$\frac{8}{3}v_1+\frac{2}{3}v_2$
$FeNi-L1_1$	$\frac{1}{2}$	$\frac{1}{2}$	$3v_1 + 3v_2$
$FeNi-L10$	$\frac{1}{2}$	0	$4v_1$
$FeNi2-Cl1f$	$\frac{11}{17}$	$\frac{11}{17}$	$\frac{8}{3}v_1+\frac{2}{3}v_2$
$FeNi3-L12$	$\frac{25}{34}$	1	$3v_1$
$FeNi7-cI32$	$\frac{33}{34}$	$\frac{29}{34}$	$rac{3}{2}v_1 + \frac{3}{4}v_2$

A better result [Fig. $5(b)$] is obtained with first and second nn pair interactions, taking a constant ratio $\alpha = v_2/v_1 = -0.7$ (the agreement is very sensitive to the value of α , except in the range $\alpha \in [-0.6, -0.7]$. The formation enthalpies obtained with first and second nn interactions are close to those of the DFT calculations, in particular for the two stable phases FeNi-L1₀ and FeNi₃-L1₂ (Fig. [5\)](#page-4-0). The least well reproduced is that of the iron-rich cI32 phase, which is unstable.

Note that in this fitting procedure, the local composition around a Fe-Ni pair has been defined as the average Ni atomic fraction around the first and second nearest neighbors of the pair, excluding the two atoms which compose it. An atom neighboring the two atoms of the pair is counted twice (so that with 12 first and 6 nearest neighbors, a pair is surrounded by 0 to 34 Ni atoms). Using this definition, the formation enthalpies of the different ordered phases are the functions of v_2 and v_1 given in Table III, together with the values of the local composition x_1 and x_2 around the first and second nn Fe-Ni pairs. Other definitions of the local composition are possible and we have tested some of them (taking into account the two atoms of the pairs, or counting each surrounding Ni atom only once). The definition chosen here gives a slightly better fit, although the differences are small.

We did not obtain significantly better results by introducing third and fourth nn interactions. In the following we will therefore restrict to the PIM with first and second nn interactions and $\alpha = -0.7$, corresponding to the results shown in Figs. [4](#page-4-0) and $5(b)$.

3. Transition between parameters at high and low temperatures

The final PIM will therefore use first and second neighbor pair interactions with a constant $\alpha = v_2/v_1 = -0.7$ ratio:

(i) At 0 K the variations of v_2 and v_1 with the composition are fitted to the formation enthalpies of SQS and ordered structures calculated by Li and Fu [\[17\]](#page-11-0) using DFT methods, as summarized in Figs. [5](#page-4-0) and [4.](#page-4-0)

(ii) At high temperatures the variations of v_2 and v_1 with the composition are fitted to the Gibbs free energies of the γ solid solution, from the CALPHAD study of Cacciamani *et al.* $[18]$.

FIG. 6. The evolution of the coefficient $L_2^{PIM}(T)$ with the temperature.

These two sets of parameters differ only in the nonmagnetic part of parameters v_2 and v_1 , which is described by Redlich-Kister polynomials having different order and coefficients (respectively, L_i^{DFT} and L_i^{CALPHAD}). The final parameters are obtained by using coefficients $L_i^{PIM}(T)$ which evolves gradually from one to the other according to:

$$
L_j^{\text{PIM}}(T) = \exp\left(-\frac{T}{T_j}\right) L_j^{\text{DFT}} + \left[1 - \exp\left(-\frac{T}{T_j}\right)\right] L_j^{\text{CALPHAD}}(T) \quad (19)
$$

with $T_i = 400$ K for $j = 0, 1, 2$ and $T_j = 80$ K for $j = 3, 4, 5$. The example of coefficient L_2^{PIM} is given in Fig. 6. The temperatures T_j have been chosen so as to give the Gibbs free energy of CALPHAD for $T > 1000$ K, at temperatures where it is derived from numerous and reliable experimental data. The influence of these transition temperatures on the phase diagram will be discussed later.

Let us note finally that the Gibbs free energy of mixing of the solid solution, the formation enthalpies of SQS or ordered structures and the FCC phase diagram, depend only on the parameters v_n . We have chosen to take $g_{\text{FeFe}}^{(n)}$ and $g_{\text{NiNi}}^{(n)}$ interactions independent of the concentration but dependent on the temperature and adjusted to the free enthalpies of the pure metals [Eq. [\(12\)](#page-3-0)]. Only the $g_{\text{FeNi}}^{(n)}$ interactions are dependent on local concentration. This choice does not affect the results of the present study, but it allows a better description of the properties of point and diffusion defects [\[9\]](#page-10-0), which we will address in future work. It also makes the Monte Carlo simulations slightly less time consuming.

III. MONTE CARLO SIMULATIONS

We will now use Monte Carlo simulations to measure Gibbs free energies of the PIM (including the configuration entropy) at different compositions and temperatures and build the FCC phase diagram.

A. Semigrand canonical isotherms

The equilibrium properties of the PIM are determined by Monte Carlo simulations carried out in the semigrand canonical ensemble. In general, we use a system of $N = 4 \times$

FIG. 7. Evolution of the long-range parameter η and of the shortrange order parameters σ_1 and σ_2 in FeNi₃ as a function of *T* (Monte Carlo simulations and experiments by Kozlov *et al.* [\[51\]](#page-11-0)).

163 atoms, with periodic boundary conditions. Exchanges are tried between a randomly chosen atom of the system and an atom taken in a reservoir, with a given difference of chemical potential $\Delta \mu = \mu_{Ni} - \mu_{Fe}$. By changing $\Delta \mu$, one modifies the equilibrium concentration (Figs. 8 and 9). A total of 500 increments for a interval of 1 eV in $\Delta \mu$ are used to go from pure iron to pure nickel and then 500 increments to go the other way. For each value of $\Delta \mu$, 5×10^6 attempts of atomic exchange (or Monte Carlo steps, MCS) are performed before measuring the equilibrium composition and order parameters. For building the phase diagram of Fig. [16,](#page-8-0) a larger system of $N = 4 \times 24^3$ atoms and much smaller increments of $\Delta \mu$ are used, in order to get a better precision (up to 100 increments for a interval of 0.04 in $\Delta \mu$).

To identify the different ordered phases, the FCC lattice is divided into four simple cubic sublattices, shifted by a distance $a/2$ in the *x*, *y*, *z* directions [\[50\]](#page-11-0). We measure the Ni concentration on each sublattice and the long range order parameter defined as:

$$
\eta = \frac{1}{4} \sum_{i=1}^{4} \left| \frac{x_i}{x} - 1 \right|,\tag{20}
$$

FIG. 8. Monte Carlo simulations: evolution of the Ni concentration *x* and long-range order parameter η of the PIM for Fe-Ni alloys at 1000 K, as a function of the difference in chemical potentials $\Delta \mu = \mu_{\text{Ni}} - \mu_{\text{Fe}}.$

FIG. 9. Monte Carlo simulations: evolution of the Ni concentration *x* and long-range order parameter η of the PIM for Fe-Ni alloys at 600 K, as a function of the difference in chemical potentials $\Delta \mu = \mu_{\text{Ni}} - \mu_{\text{Fe}}.$

where x_i is the Ni concentration on the sublattice *i*. With this definition, $\eta = 1$ in the perfect FeNi-L1₀ structure and $\eta =$ 0.5 in the perfect $FeNi₃-L1₂$ structure.

The short range order is characterized by the Warren-Cowley parameters for the first and second nearest neighbors:

$$
\sigma_i = 1 - \frac{f_{\rm Ni}^{(i)}}{x},\tag{21}
$$

where $f_{\text{Ni}}^{(i)}$ is the average fraction of Ni atoms among the *i*th nn of the Fe atoms. For a perfect L1₂ ordered phase, $\sigma_1 = -0.33$ and $\sigma_2 = +1$.

The evolution of the long-range η [Eq. (20)] and of the short-range order parameters σ_1 and σ_2 [Eq. (21)], in an alloy of composition $FeNi₃$ as a function of the temperature, is shown in Fig. 7. The $L1_2$ ordered phase is found to be stable up to 765 K (instead of 790 K for CALPHAD [\[18\]](#page-11-0)). The evolution of η is in good agreement with the experiments of Kozlov *et al.* [\[51\]](#page-11-0) (which gives a slightly higher ordering temperature: 807 K). The discontinuity at the order/disorder temperature indicates a first-order transition. A significant short range order remains well above the disordering temperature, especially between the first nearest neighbors.

Two examples of isotherms $x = f(\Delta \mu)$, at $T = 1000$ K and $T = 600$ K, are shown in Figs. 8 and 9. At 1000 K, $x(\Delta \mu)$ evolves continuously, with $\eta \simeq 0$: The disordered solid solution is stable in the whole composition range. At 600 K, $\eta \simeq 0.76$ to 0.53 between $\Delta \mu = -0.188$ and -0.068 eV, which corresponds to an over stoichiometric $L1_0$ phase, and $\eta \simeq 0.49$ between $\Delta \mu = -0.05$ and $+0.3$ eV, which corresponds to an almost stoichiometric $L1_2$ phase. Discontinuities and hysteresis on the $x(\Delta \mu)$ curve indicate first order transitions and the limits of two-phase domains.

B. Gibbs free energy of mixing

Using the definition of chemical potentials: $\mu_i =$ $(\partial G/\partial n_i)_{T,P,n_i}$ and integrating the $\Delta \mu(x)$ curve, we obtain the Gibbs free energy of mixing *G*mix. The results obtained at different temperatures can be directly compared with the *G*mix of the CALPHAD study [\[18\]](#page-11-0). In each case, one can

FIG. 10. Gibbs free energy of mixing of the Fe-Ni solid solutions at 1500 K: PIM (dotted lines) vs CALPHAD (full lines), with the separate magnetic, excess, and configurational entropic contributions.

also compare separately the enthalpy H_{mix} and entropy S_{mix} of mixing, as well as the magnetic, excess, and configuration contributions.

Figure 10 for example, gives the Gibbs free energy of mixing of the Fe-Ni solid solution at $T = 1500$ K. The PIM is in very good agreement with the CALPHAD study. At this high temperature (well above T_c), the magnetic contribution is negligible. However it is worth noticing that the excess contribution is slightly lower in the PIM, with a minimum of −0.038 eV at *x* = 0.69 instead of −0.033 eV in CALPHAD. The difference is due to the fact that in the PIM, some short range order remains in the γ solid solution, even at this high temperature (Fig. [7\)](#page-6-0).

The effect is clearer if one separates the enthalpic and entropic contributions of $G_{\text{mix}} = H_{\text{mix}} - TS_{\text{mix}}$. The enthalpy of mixing (Fig. 11) is dominated by the excess term. Due to the remaining short range order ($\sigma_1 = -0.066$ and $\sigma_2 = 0.048$), the PIM gives a minimum of $H_{\text{mix}} = -0.054 \text{ eV}$ at $x = 0.67$ instead of −0.047 eV in CALPHAD. This discrepancy on *H*_{mix} only disappears at very high temperature. At 3000 K (i.e., above the liquidus), the maximum difference between the PIM and CALPHAD is still $\Delta H_{\text{mix}} = 0.0022$ eV (for $\sigma_1 = 0.06$) and $\sigma_2 = 0.013$). It becomes negligible only above 5000 K.

FIG. 11. Enthalpy of mixing of the Fe-Ni solid solutions at 1500 K: PIM (dotted lines) vs CALPHAD (full lines), with separate magnetic and excess contributions.

FIG. 12. Entropy of mixing of the Fe-Ni solid solutions at 1500 K: PIM (dotted lines) vs CALPHAD (full lines), with separate magnetic, excess, and configurational contributions.

The entropy of mixing of the the PIM (Fig. 12) is dominated by the entropy of configuration, which is very close to the ideal *S*_{id} of CALPHAD. In the PIM as in CALPHAD, the excess and magnetic contributions to the entropy of mixing are less important and negative (except below $x \approx 0.1$). At $x = 0.67$, the discrepancy due to the short range order is only $S_{\text{conf}} - S_{\text{id}} = 0.15 \times 10^{-5} \text{ eV}$ /(atom K), which corresponds to a difference of $T(S_{\text{conf}} - S_{\text{id}}) = -0.00225 \text{ eV/atom}$. The difference on S_{mix} partly compensates for the one on H_{mix} , which explains the good agreement on G_{mix} between the PIM and CALPHAD, even below 1500 K, when the short range order increases. The G_{mix} of the PIM and CALPHAD is therefore in very good agreement in the whole range of composition and temperature where the γ solid solution is stable (Fig. 13).

The difference between the Gibbs free energy of mixing of the PIM and CALPHAD [Fig. $14(a)$] slightly increases at

FIG. 13. Gibbs free energy of mixing of the Fe-Ni solid solution of the PIM and CALPHAD [\[18\]](#page-11-0), at different temperatures. For the sake of clarity, each curve is shifted downwards by a constant Δ given on the figure.

FIG. 14. (a) Gibbs free energy of mixing of Calphad and the PIM and (b) long range order parameter of the PIM, for Fe-Ni alloys at 700 K.

lower temperatures, when the ordered phase $L1₂$ stabilizes, i.e., when the long-range order parameter η is close to 0.5, between $x \approx 0.6$ and $x \approx 0.82$ [Fig. 14(b)]. This is not surprising since the PIM parameters at low temperatures are not fitted on CALPHAD but on DFT calculations which give a different energetic landscape, especially for the disordered phase (Sec. [II C\)](#page-3-0). In spite of this difference, the $G_{mix}(x)$ curve of the PIM is still in good agreement with CALPHAD at $T = 700$ K.

At 650 K, the agreement between the Gibbs free energy of mixing of the PIM and CALPHAD is still quite good for the compositions where the γ solid solution and the L1₂ phase are stable [Fig. $15(a)$]. However the evolution of the long-range parameter η as a function of the nickel concentration x now

FIG. 15. (a) Gibbs free energy of mixing of Calphad and the PIM and (b) long range order parameter of the PIM, for Fe-Ni alloys at 650 K.

FIG. 16. (a) The Fe-Ni FCC phase diagram: comparison between the PIM and experiments (1950 Jos = $[52]$, 1963 Heu = $[53]$, 1980 Van = $[54,55]$. (b) Zoom in of the region of the L1₂ ordering temperature.

displays two bumps [Fig. $15(b)$]. The second one (between $x \approx 0.63$ and $x \approx 0.85$) still corresponds to the L1₂ phase. The phase is almost perfectly ordered for the stoichiometric composition FeNi₃ ($\eta \simeq 0.5$ for $x = 0.75$). However, the PIM predicts that the FeNi-L1₀ phase is stable between $x \approx 0.52$ and 0.63, while it only appears at lower temperature (below 316 K) according to the CALPHAD model [\[18\]](#page-11-0). Note that it is not perfectly ordered ($\eta \simeq 0.6$ instead of 1 for the perfect order), because it is slightly nonstoichiometric $(x > 0.5)$ and because 650 K is close to its order disorder-temperature (680 K).

C. FCC phase diagram

The FCC phase diagram of the Fe-Ni system predicted by the PIM is shown in Fig. 16 and compared with experimental data [\[52–](#page-11-0)[55\]](#page-12-0). It can be also compared to the FCC diagram of Cacciamani *et al.* (Fig. 8 in Ref. [\[18\]](#page-11-0)).

The ordering temperatures of the $FeNi₃-L1₂$ phase are slightly different: The PIM gives 765 K, a little lower than 790 K for the CALPHAD study of Cacciamani *et al.* [\[18\]](#page-11-0) (which is adjusted to the experimental value). As in CAL-PHAD, the limits of the two-phase domain FeNi₃ + γ for $x >$ 0.75 are slightly shifted towards lower values ($\Delta x \simeq -0.04$) at 571 K) by comparison with the experiments by Heumann

FIG. 17. The Fe-Ni FCC phase diagram of the PIM without magnetic contribution.

et al. [\[53\]](#page-11-0). As in CALPHAD, the width of the two-phase domain γ + FeNi₃ at $x < 0.75$ is smaller than the one of the two-phase domain at $x > 0.75$ (earlier CALPHAD studies predicted a larger two-phase field, as in Fig. [1\)](#page-1-0). Here it should be noted that, except in the vicinity of the ordering temperature at $x = 0.75$, the experimental data for these two-phase fields are going back to 1963 [\[53\]](#page-11-0) and are only available for one temperature.

The discrepancy is more important for the $FeNi-L1₀$ phase: The PIM predicts an ordering temperature of 680 K instead of 316 K for CALPHAD. The CVM study of Mohri *et al.* [\[26\]](#page-11-0) predicts an intermediate ordering temperature (483 K). A direct estimation by DFT calculations (taking into account the vibrational entropy, but not the configurational entropy of the FeNi-L1₀ phase) gives 640 K. There is no precise experimental measurement available for the evolution of the degree of order as a function of the temperature (as for the FeNi₃ phase, in Fig. 7), but the experimental observations under electron irradiation by Reuter *et al.* [\[23\]](#page-11-0) suggest an ordering temperature of approx. 593 K.

As in CALPHAD, the FCC phase diagram of the PIM also displays a two-phase field with an equilibrium between a ferromagnetic (γ_f) and a paramagnetic (γ_p) solid solution, at $x = 0.4$ and below $T = 660$ K. This phase separation has been first predicted by Chuang *et al.* [\[56\]](#page-12-0), but it has not been confirmed experimentally. The PIM is able to reproduce this two-phase field because it includes the magnetic contribution of the CALPHAD model. It is however more limited in temperatures than in Ref. [\[18\]](#page-11-0), because of the higher stability of the FeNi-L1 $_0$ phase in the PIM, which limits its extension below 680 K.

The phase diagram of the PIM without the magnetic contribution is shown in Fig. 17. As in the study by Cacciamani *et al.*, the nonmagnetic phase diagram reduces the critical temperature of $L1_2$ by approx. 118 K and shows no $\gamma_f - \gamma_p$ two-phase field.

Finally, let us recall that the parameters of the PIM and the results of Sec. [III](#page-5-0) have been obtained with parameters fitted to DFT calculations at 0 K, the CALPHAD data of Ref. [\[18\]](#page-11-0) at high temperatures, and a transition between the high and low temperature regimes controlled by the exponential interpolation of Eq. (17) . With the chosen T_i temperatures, the Redlich-Kister coefficients of the PIM are almost identical to

FIG. 18. The Fe-Ni FCC phase diagram of the PIM using a different transition between high and low temperature parameters.

those of CALPHAD above approximately 1000 K. To assess the effect of this choice on the phase diagram, we have performed some simulations with a different set of parameters: $T_i = 50$ K for $j = 0, 1, 2$ and $T_j = 10$ K for $j = 3, 4, 5$ (using the same notation as in Sec. $\text{IIC } 3$). With these parameters, the Redlich-Kister coefficients of the PIM becomes almost identical to those of CALPHAD at a lower temperature (approx. 315 K). The resulting phase diagram is shown in Fig. 18. It is not very different from the previous one [Fig. $16(a)$], except from a moderate increase of the ordering temperatures of the $L1_0$ and $L1_2$ phases. The reason is that with the new parameters, the ordering tendency is a little more pronounced below 1000 K (Fig. [4\)](#page-4-0). As a consequence, the $\gamma_p - \gamma_f$ two-phase domain almost completely disappears.

IV. DISCUSSIONS AND CONCLUSIONS

We have presented in this study a method for developing a pair interaction model for Fe-Ni alloys, fitted at 0 K on the enthalpies of formation of ordered and disordered structures (computed by first-principle methods) and at high temperatures on the Gibbs free energy of the γ solid solution (as given by a CALPHAD study and its underlying experimental data).

Thanks to the temperature and concentration dependence of the pair interactions, the PIM is able to reproduce precisely these two types of energetic properties and to distinguish between excess, magnetic, and configurational entropic contributions. The identification between CALPHAD and the PIM is not perfect, because the configurational entropy and short-range order in the solid solution is described more approximately in CALPHAD methods than in the Monte Carlo simulations used to determine the equilibrium properties of the PIM. The CALPHAD method is more flexible than an atomistic model: The properties of each phase can be adjusted very precisely and independently on the experiments. The PIM imposes some constraints but, combined with Monte Carlo simulations, it ensures a consistent description of the short- and long-range order and of the entropy of configuration.

Despite these differences, the Gibbs free enthalpies of mixing of the γ solid solution, as given by CALPHAD, are very well reproduced by the PIM, throughout the composition and temperature range of stability of the phase. The Gibbs

free enthalpy of the FeNi₃-L1₂ phase is also well reproduced, although the parameters of the PIM and CALPHAD for that phase are not fitted on the same DFT calculations. At high temperatures, the FCC phase diagram involves only these two phases, and both methods give similar results (especially for the order-disorder transition in the vicinity of FeNi₃, and for the $\gamma_p - \gamma_f$ phase separation).

On the other hand, both models predict that the FeNi-L1 $_0$ phase is stable at low temperature but with different ordering temperatures. Taking the electron irradiation experiments [\[23\]](#page-11-0) as a reference, it seems that CALPHAD underestimates the ordering temperature, while the PIM overestimates it. It should be noted here that alloys under irradiation may be not fully at equilibrium, so that no real experimental thermodynamic data are available for this phase, and that both the CALPHAD model and the PIM are only fitted to DFT calculations of enthalpies of formation at 0 K. The PIM and CALPHAD should therefore be both improved to properly describe this phase. One possibility is to use DFT methods to compute finite temperature contributions. These methods are computationally expansive but can separate each energetic contribution and provide results at intermediate temperature (say, between 0 and 400 $^{\circ}$ C), where experimental results are rarer and perhaps less accurate. An example is given in the study of K. Li and C.-C. Fu [\[17\]](#page-11-0), which shows that the vibrational entropy decreases the ordering temperatures of the $L1_0$ and $L1₂$ phases by, respectively, 280 and 200 K.

In spite of this limitation, the PIM model gives a satisfactory description of the γ solid solution and of the L1₂ phase. Of course, such a model is necessarily dependent on the CALPHAD data it uses. For the magnetic contribution for example, we rely on the recent study by Cacciamani *et al.*, which is itself based on a large experimental database (with

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measurements of specific heats, Curie temperatures, magnetic moments, etc. of γ solid solutions with various compositions, described in Refs. [\[18](#page-11-0)[,57\]](#page-12-0)). For the same reason, our model takes into account, but cannot distinguish between, energetic contributions that are not identified separately in CALPHAD (for example, harmonic and nonharmonic vibrational contributions—which are both gathered in the excess Gibbs free energy, together with the nonideal part of the configurational entropy). However it could easily be updated to take into account future improvement on that points. It could also be easily extended to Fe-Ni-Cr ternary alloys or to other binary or ternary systems. Finally the PIM is simple enough to be used as a basis for atomistic kinetic Monte Carlo methods to simulate the kinetics of homogeneous ordering or of heterogeneous precipitation of the $L1₂$ phase or to model the interdiffusion properties in the γ solid solution at high temperature. It is indeed not more numerically expensive than the PIM for BCC Fe-Cr alloys described in Ref. [\[47\]](#page-11-0), which has been used for the simulations of precipitation kinetics [8,9] or irradiation effects $[11,12]$. As in these studies, the modeling of kinetics will require the extension of the PIM to describe the formation and migration properties of point defects.

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