

Prediction of Martensite Start Temperature for Lightweight Fe-Mn-Al-C Steels

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Abstract A tailor-made thermodynamic database of the Fe-Mn-Al-C system was developed using the CALPHAD approach. The database enables predicting phase equilibria and thereby assessing the resulting microstructures of Fe-Mn-Al-C alloys. Available information on the martensite start (M_s) temperature was reviewed. By employing the M_s property model in the Thermo-Calc software together with the new thermodynamic database and experimental M_s temperatures, a set of model parameters for the Fe-Mn-Al-C system in the M_s model was optimised. Employing the newly evaluated parameters, the calculated M_s temperatures of the alloys in the Fe-Mn-Al-C system were compared with the available measured M_s temperatures. Predictions of M_s temperatures were performed for the alloys, Fe-10, 15 and 20 wt.% Mn-xAl-yC. The predictability of the M_s model can be further validated when

new experimental M_s temperatures of the Fe-Mn-Al-C system are available.

Keywords CALPHAD · Fe-Mn-Al-C · lightweight steels · martensite start temperature

1 Introduction

Lightweight steels have aroused scientific and industrial interest due to their excellent strength and ductility. The Fe-Mn-Al-C system forms a class of lightweight steels that exhibit a good combination of mechanical properties (yield strength: 0.4–1.0 GPa, ultimate tensile strength: 0.6–2.0 GPa; elongation: 30–100%^[1–7]) and weight reduction (1.3% density reduction per 1 wt.% Al addition^[4]). The promising mechanical properties and low density make them good candidates for producing e.g. automotive body panels and tanks for liquefied natural gas (LNG) and transportation.^[8,9] Depending on the balance of the alloying elements, these lightweight steels have either an austenitic or duplex microstructure both exhibiting ultra-high-strength characteristics since austenite gives rise to different strengthening mechanisms.^[6,10–13] Stacking fault energy (γ_{SFE}) has been used to interpret various kinds of mechanisms, such as transformation-induced plasticity (TRIP), twinning-induced plasticity (TWIP) and dislocation glide. Generally, the relative values of γ_{SFE} determining each mechanism are $\gamma_{SFE}^{\beta \text{ or } \alpha} < \gamma_{SFE}^{\text{twinning}} < \gamma_{SFE}^{\text{slip}}$.^[14–16] Martensitic transformation is diffusionless and results in a displacive change of structure, without changing the chemical composition between parent and product phases. Martensite start (M_s) temperature is defined as the temperature at which martensite starts to form. Knowledge of

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M_s temperature is of critical importance for steel producers to guide the compositional and microstructural design. Computational materials modelling is an efficient tool in steel production, for example, to predict the transformation temperature, transformation rate and alloying effect on the phase transformation. Technically, being able to describe characteristics of martensitic transformation by using a complete physical model gives a relatively high accuracy. However, one has to consider the complexity of martensitic transformation and that the current knowledge is not mature enough to derive a full physical description.^[17] So far, several available methods to predict the M_s temperature highly rely on experimental data in order to extract an empirical expression, which can only be applied in a limited range of alloying contents. Consequently, a semi-empirical approach, based on well-established thermodynamic databases and available experimental data on M_s temperature, may be the best available option for the prediction of M_s temperatures in steels.

When it comes to thermodynamic modelling of martensitic transformation, the Gibbs energy difference between parent and product phase is applied to describe the chemical driving force. In order to form any of either phase, this driving force should bypass the chemical Gibbs energy barrier. The concept of the T_0 temperature was introduced by Kaufman and Cohen^[18] to describe the temperature at which the Gibbs energies of parent and product phases are equal. The martensitic transformation starts at the M_s temperature, usually well below T_0 , because the reaction does not occur immediately when martensite becomes thermodynamically more stable than austenite.^[19] For example, for the martensitic reaction of FCC (γ) to HCP (ϵ), each phase has a Gibbs energy dependent on temperature and composition. For a given alloy composition, the Gibbs energies of the two phases are identical at the T_0 temperature,

$$G_m^\gamma(T_0) = G_m^\epsilon(T_0) \tag{Eq 1}$$

where G_m^γ and G_m^ϵ refer to the molar Gibbs energy of γ and ϵ respectively.

At any other temperature, the Gibbs energies of FCC and HCP martensites differ with each other, which is used as a quantitative measure of the driving force for the martensitic transformation. As given in the work by Palumbo^[19] and Baruj et al.,^[20] one can obtain the critical driving force as,

$$\Delta G_m^*(M_s) = -\Delta G_m^{\gamma-\epsilon} = G_m^\gamma - G_m^\epsilon \tag{Eq 2}$$

and for the reverse transformation, the driving force is defined as,

$$\Delta G_m^*(A_s) = -\Delta G_m^{\epsilon-\gamma} = G_m^\epsilon - G_m^\gamma \tag{Eq 3}$$

Upon rapid cooling, when a critical driving force reaches a certain value of $\Delta G_m^*(M_s)$, the $\gamma \rightarrow \epsilon$ martensitic transformation occurs. Equally, the critical driving force for the reverse $\epsilon \rightarrow \gamma$ transformation upon heating is defined as $\Delta G_m^*(A_s)$. The two values are positive as they describe the kinetic barriers or resistances to the transformation. They are generally referred to as ‘*resistance-to-start-the-transformation*’ energies (RSTEs).^[20]

Basically, prediction of M_s temperatures aims at finding the temperature at which the available driving force of the transformation can bypass the critical driving force. The critical driving force is usually derived by evaluating a large amount of experimental M_s temperatures. The available driving force can be achieved from thermodynamic database in the form of Gibbs energy of the desired phases. Therefore, the accuracy of the thermodynamic database is one of the factors affecting the reliability of predicted M_s temperature. The importance of thermodynamic database will be further discussed in the following content.

This work is one part of a European Research Fund for Coal and Steel (RFCS) project entitled as ‘screening of tough lightweight Fe-Mn-Al-C steels using high throughput methodologies’ (LIGHTOUGH).

In the present work, we briefly introduced a thermodynamic database for the Fe-Mn-Al-C system developed for the LIGHTOUGH project. Based on this database and available experimental M_s temperature data, the model parameters in the M_s property model in the Thermo-Calc software^[21] were optimised. The M_s temperatures of the Fe-Mn-Al-C system in the M_s property model were calculated and compared with the available experimental M_s temperatures. The M_s temperatures were predicted for the alloys Fe-10, 15 and 20 wt.% Mn- x Al- y C.

2 Thermodynamic Database for the Fe-Mn-Al-C System

Fe-Mn-Al-C based lightweight steel is the core of the present study. A thermodynamic database for this quaternary system was constructed based on the constituent binary and ternary systems. An overview of the systems assessed was described. The Thermo-Calc software^[21] was employed in the reviewed assessments unless stated otherwise.

2.1 Fe-Mn-Al System

The Fe-Mn-Al system has received large attention which has resulted in experimentally well-determined phase equilibria. In the Al-rich region, a number of intermetallic phases are stable, such as $Al_{13}Fe_4$, Al_5Fe_2 , Al_2Fe and

Al₈Mn₅. Fcc and bcc dominate in the Fe-rich part. With the addition of Al to a critical amount, order/disorder transformations occur and bcc-based B2 and D0₃ form, which may embrittle the steels. Lindahl et al.^[22,23] assessed the Fe-Mn-Al system by taking into account these order/disorder transformations. The partitioning model was used to describe the chemical ordering,^[23] and the ordering contribution, ΔG_m^{ord} , was added to the disordered part of Gibbs energy, i.e.

$$G_m = G_m^{dis}(x_i) + \Delta G_m^{ord} \quad (\text{Eq 4})$$

$$\Delta G_m^{ord} = G_m^{ord}(y_i) - G_m^{ord}(y_i = x_i) \quad (\text{Eq 5})$$

In addition, when using a four-sublattice (4SL) model to describe bcc, the importance of ternary end-member parameters was addressed and a method to evaluate these end-members was presented.^[23] As reported by Hallstedt et al.,^[24] despite the advantage of using 4SL model to describe the bcc-based phases, the energy difference between B2 and D0₃ is very small in the ternary system, therefore, a two-sublattice model should be sufficient for most practical purposes.

Recently, Balanetsky et al.^[25] and Priputen et al.^[26] experimentally investigated the Fe-Mn-Al system with respect to the phase equilibria at the Al-rich region and the isothermal section at 1273 K, respectively. By considering the measurements by Balanetsky et al.^[25] and Priputen et al.^[26] and the reassessment of the Fe-Al binary system,^[27] Zheng et al.^[28] reassessed the Fe-Mn-Al ternary system. In that work the Al-Mn system^[28] was also reassessed by introducing stable γ_1 and metastable ϕ for the first time. Based on the revised thermodynamic parameters,^[28] the experimental phase equilibria^[25,26] over the whole composition and wide temperature ranges were well reproduced.

2.2 Al-C-Mn System

For lightweight steels, the kappa phase plays a significant role in mechanical properties due to its precipitation strengthening effect. However, the Al-C-Mn system is still poorly investigated and scarce experimental data are available. It leads to a difficulty in performing a thermodynamic assessment, especially to obtain a thermodynamic description of the kappa phase. Several attempts were made to model kappa, for example, it has been modelled as (Mn)₃(Al)₁(C,Va)₁^[29] and (Mn)₃(Al, Mn)₁(C,Va)₁.^[30] Compared with the phase equilibria measurements from Bajenova et al.^[31,32] at 1373 and 1473 K, the attempted modelling of the kappa was insufficient as it could not describe its wide homogeneity range. Zheng et al.^[33] recently performed a thermodynamic assessment of the Al-C-Mn system with a particular attention paid to kappa. It

was modelled as an ordered form of fcc as regards to using four substitutional sublattices but with only a quarter of interstitial sites compared to FCC: (Al,Mn)_{0.25}(-Al,Mn)_{0.25}(Al,Mn)_{0.25}(Al,Mn)_{0.25}(C,Va)_{0.25}. Ab initio calculations were carried out at 0 K for the end-members of kappa. Based on the acquired thermodynamic parameters,^[33] the calculated isothermal sections at 1373 and 1473 K were consistent with the experimental data from Bajenova et al.^[31,32]

2.3 Fe-Al-C System

The Fe-Al-C system has been extensively investigated and a literature review on this ternary system can be found in the recent assessment work by Zheng et al.^[27] The partitioning model was employed to describe the order/disorder transformations, as expressed in Eq 4 and 5. Additionally, the first-principle calculation was made to obtain reliable enthalpies of formation of the ordered phases in this ternary system. Using the already described sublattice model for kappa,^[33] Zheng et al.^[27] well reproduced the wider compositional range that was measured by Phan et al.^[34] and Palm and Inden.^[35] As can be seen in Fig. 1, compared with the assessment work by Phan et al.^[34] and Connetable et al.,^[36] Zheng et al.^[27] made a substantial improvement of the description of kappa.

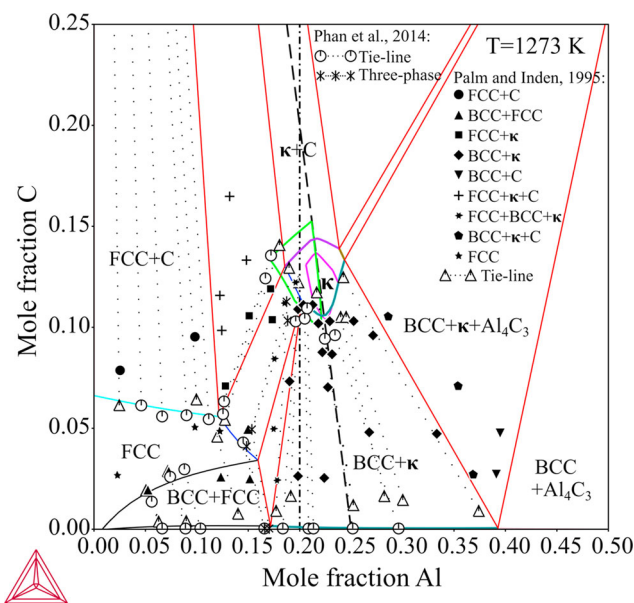


Fig. 1 Comparison among the calculated isothermal section at 1273 K by Zheng et al.,^[27] Phan et al.^[34] and Connetable et al.^[36] for the Fe-Al-C system. The solid green and magenta lines are the phase boundary of kappa calculated by Phan et al.^[34] and Connetable et al.,^[36] respectively. The dashed and dash-dotted lines denote $x_{Fe}/x_{Al} = 3$ and $x_{Al} = 0.2$, respectively, which denotes the limitation of the earlier descriptions for kappa.^[34,36] The Figure is reprinted with the permission from Zheng et al.^[27]

2.4 Fe-Mn-C System

Huang^[37] performed a thermodynamic assessment of this ternary system using the CALPHAD approach. The thermodynamic description is widely accepted since it well reproduces most of the characteristics of this ternary system except for a poor agreement with the liquidus surface projection determined by Schürmann and Geissler.^[38] Later, Djurovic et al.^[39] conducted a thermodynamic re-evaluation of the Fe-Mn-C system. They improved the thermodynamic description of the liquid phase so it fits better with the experimental liquidus data^[38] in comparison with the work by Huang.^[37] Additionally, Djurovic et al.^[39] did ab initio calculations of the enthalpies of formation for the metastable carbides, which gave a reasonable description of carbide equilibria at low temperatures. Therefore, the assessment by Djurovic et al.^[39] was adopted in constructing the present thermodynamic database of the Fe-Mn-Al-C system.

2.5 Fe-Mn-Al-C System

As has been reviewed above, thermodynamic descriptions of the ternary systems Fe-Mn-Al, Al-C-Mn and Fe-Al-C were improved in a series of work by Zheng et al.^[27,28,33] By taking the thermodynamic description of Fe-Mn-C from

Djurovic et al.,^[39] a tailor-made thermodynamic database for the LIGHTOUGH project was constructed in the present work. Hallstedt et al.,^[24] Chin et al.^[29] and Kim and Kang^[30] previously reported thermodynamic descriptions of the Fe-Mn-Al-C system. Hallstedt et al.^[24] pointed out that a simplified model for kappa adopted in the works^[24,29,30] should be replaced by a model capable of describing order/disorder transformations. This improvement has been made in this new thermodynamic database. Within the LIGHTOUGH project, the thermodynamic database has been applied to guide the selection of alloys to be cast, to estimate the possible formation of stable phases at desired temperatures and to predict M_s temperatures for the alloys of interest.

3 Methods for Predicting M_s Temperature

The prediction of M_s temperature in the current work is based on an unreleased beta version of a *Martensite Property Model* in Thermo-Calc software.^[21] This M_s property model was developed on the basis of the work by Stormvinter et al.^[17] and Borgenstam and Hillert.^[40] The core is to derive the expression of the chemical barrier of martensitic transformation and then find the temperature where available driving force equals the barrier. Certainly,

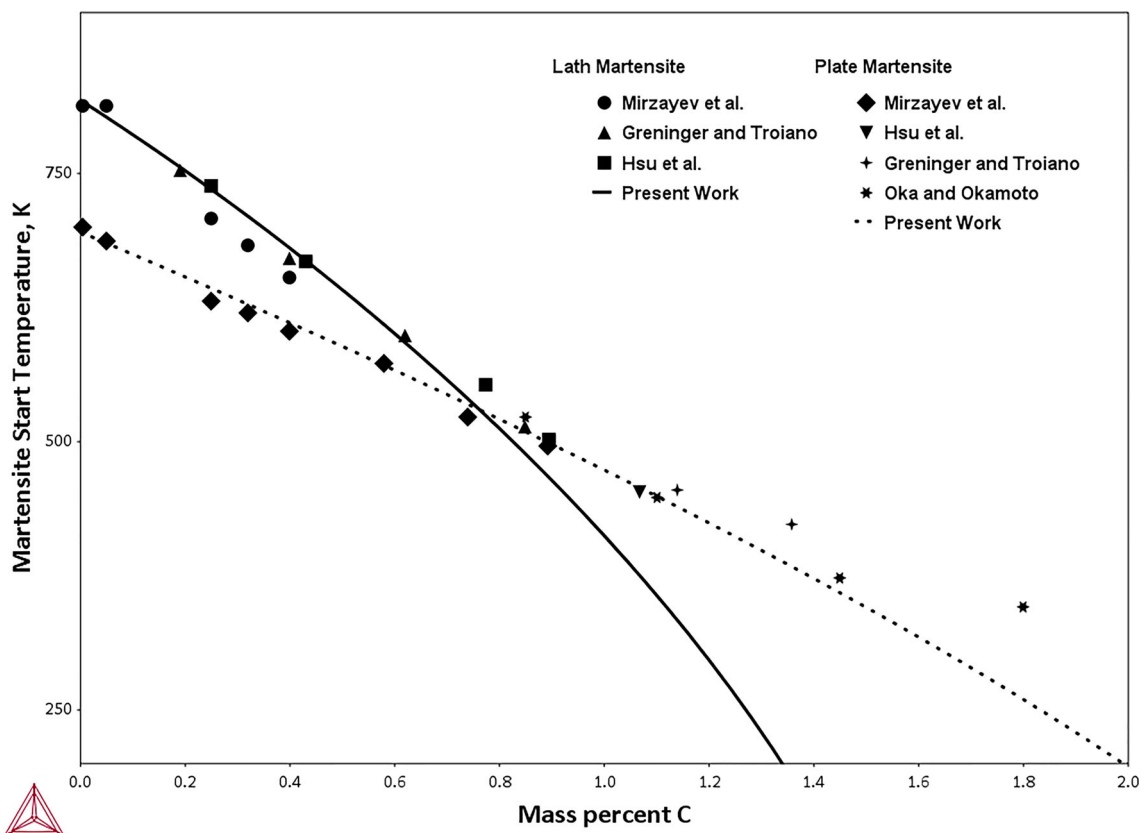


Fig. 2 Calculated M_s temperatures of $\gamma \rightarrow \alpha$ martensitic transformation in the Fe-C binary system compared with the experimental data^[46–49]

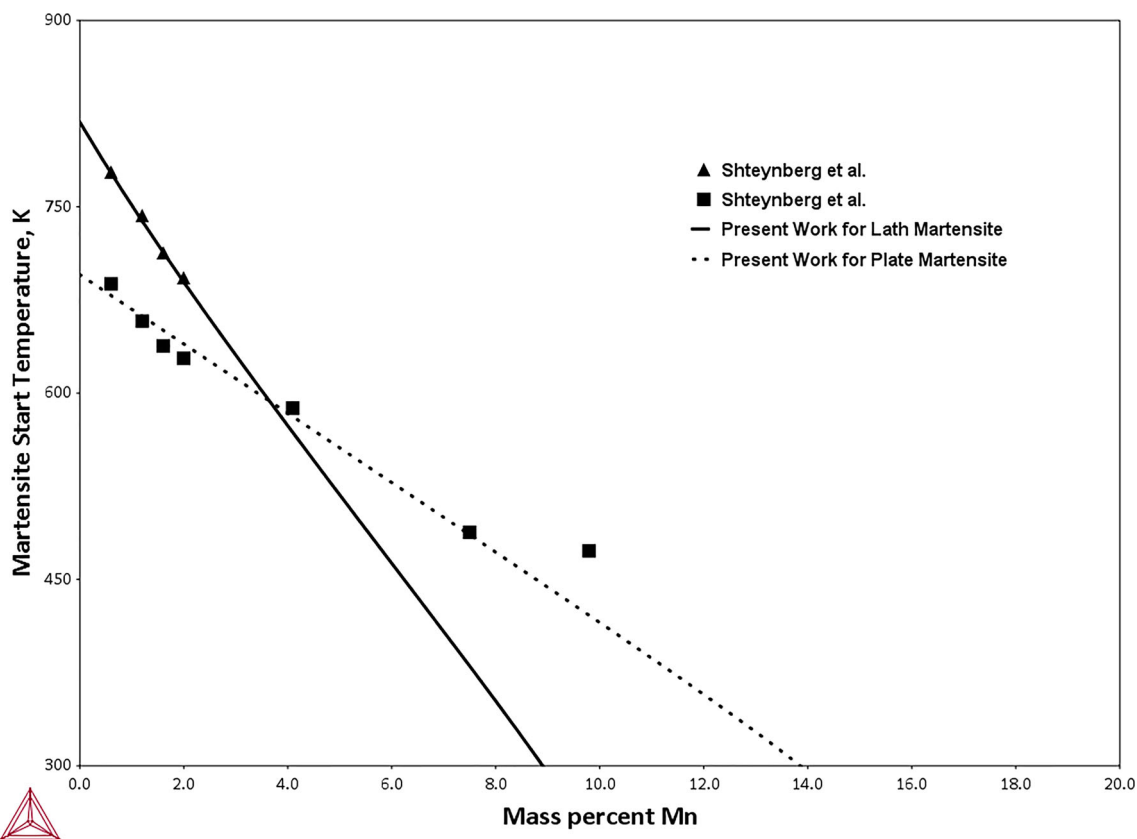


Fig. 3 Calculated M_s temperatures of $\gamma \rightarrow \alpha$ martensitic transformation in the Fe-Mn binary system compared with the experimental data^[50]

several other methods are available to predict M_s temperatures. Some representative ones will be briefly reviewed and the current approach elaborated.

3.1 Empirical Method

As has been demonstrated in the work by Peet,^[41] multiple linear regression equations were employed to summarise the influence of various alloying elements on the martensite start temperature. The general expression is as,

$$M_s = k_0 + \sum k_i w_i \quad (\text{Eq 6})$$

where k_0 is the M_s temperature of pure iron, w_i is the concentration of element i (usually in weight percentage), and k_i is the parameter relating to the concentration of each element to the change in the M_s temperature.

Although this method can predict the trend of the M_s temperature in a simple way, it is only applicable in a certain composition range of a certain system and can hardly provide insight into the mechanism of martensitic transformation. One representative work was carried out by Izumiyama et al.,^[42] that even in binary alloy systems, there is no uniform linear dependence with compositions

for various binary systems. Therefore, this method is mere statistical without considering any physical, thermodynamic or microstructural contribution.

This empirical method was improved by Wang et al.^[43] incorporating the effect of binary interactions. The nominal concentration of binary terms is defined as the square root of two chemical compositions,

$$w_{i-j} = \sqrt{w_i w_j} \quad (\text{Eq 7})$$

So Eq 6 can be revised as,

$$M_s = k_0 + \sum k_{ij} \sqrt{w_i w_j} \quad (\text{Eq 8})$$

According to Wang et al.,^[43] using Eq 8, the standard error in predicting the M_s temperature is as low as 4.2 °C.

3.2 Thermodynamic Method

Forsberg and Ågren^[44] performed a thermodynamic assessment of the Fe-Mn-Si system and calculated the M_s and A_s temperatures of the $\gamma \rightarrow \varepsilon$ martensitic transformation. On a tentative basis, they chose the value of -50 J/mol for the Gibbs energy difference between HCP and FCC at the experimentally determined M_s temperature.

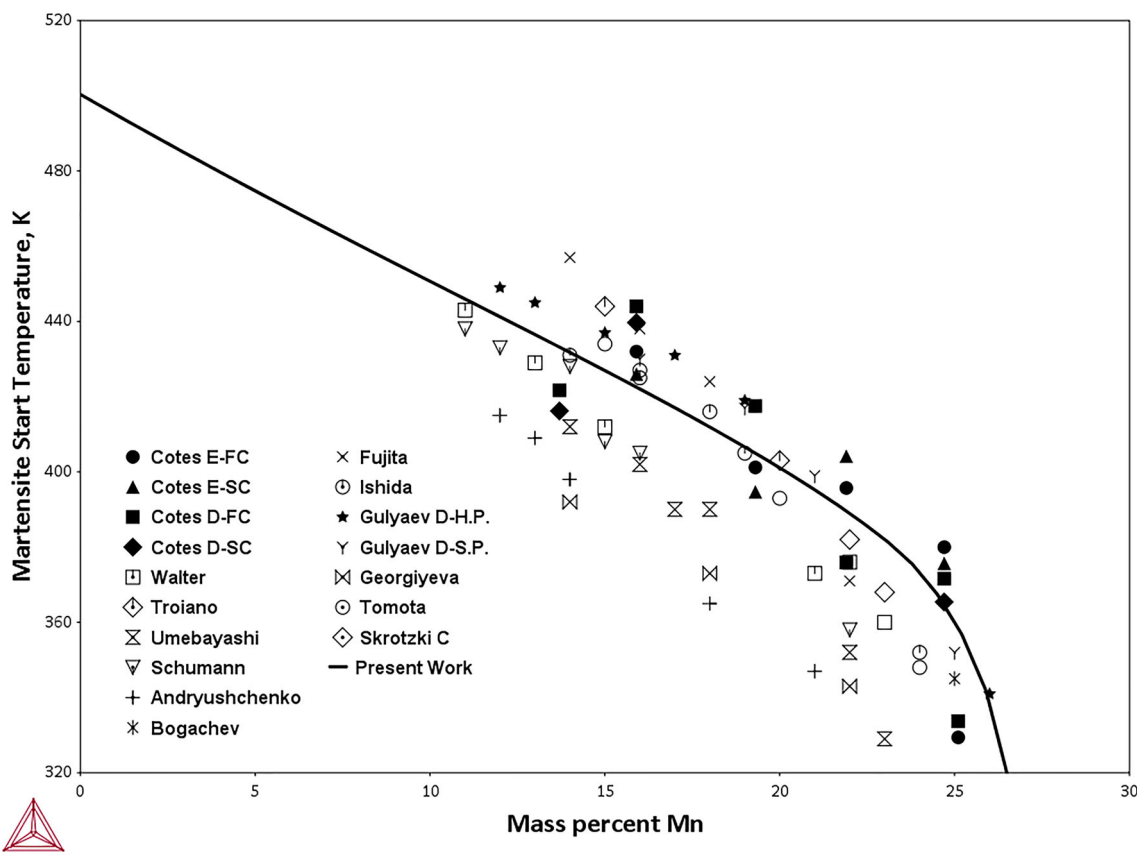


Fig. 4 Calculated M_s temperatures of $\gamma \rightarrow \varepsilon$ martensitic transformation in the Fe-Mn binary system compared with the experimental data.^[51,52] All the experimental data included in this comparison is accessible from the work by Cotes et al.^[51]

Based on the assessed thermodynamic database and the quantity of $G_m^{hcp} - G_m^{fcc} = -50 \text{ J/mol}$, the M_s and A_s temperatures of the $\gamma \rightarrow \varepsilon$ martensitic transformation were calculated and compared. The agreement is less satisfactory at higher Mn content, possibly due to an incomplete description of the HCP phase.^[19] Cotes et al.^[45] improved the descriptions of the G_m functions of various phases, based on which the M_s and A_s temperatures were predicted with a good agreement with extensive experimental results. Therefore, one may conclude that the accuracy of the thermodynamic database largely determines the reliability of the predictions of the M_s temperature.

3.3 Semi-Empirical Method: the Present Approach

Borgenstam and Hillert^[40] reviewed a number of M_s temperature data for Fe-X systems and accepted the results from rapid cooling experiments, where a range of cooling rates that show a constant martensitic transformation temperature, can be considered as M_s temperatures. They calculated the driving forces for the formation of the two kinds of martensites (lath and plate), as expressed in Eq 9 and 10. They found that the driving force for the $\gamma \rightarrow \alpha$ transformation may not be much

influenced by solution hardening but may mainly be a function of temperature.

$$\Delta G_m^{\gamma \rightarrow \alpha} = 3640 - 2.92 * T(K) \quad (\text{lath martensite, J/mol}) \quad (\text{Eq 9})$$

$$\Delta G_m^{\gamma \rightarrow \alpha} = 2100 \quad (\text{plate martensite, J/mol}) \quad (\text{Eq 10})$$

Based on the derived driving forces in Eq 9 and 10 by Borgenstam and Hillert,^[40] Stormvinter et al.^[17] extended their work into the expression as a function of temperature and composition, in order to predict the M_s temperature of commercial steels. A sufficient chemical driving force is required to bypass the barrier in order to initiate the martensitic transformation. The barrier in their work^[17] is represented as,

$$\Delta G_m^{*\gamma \rightarrow \alpha} = \sum_M u_M (1 - u_C) \Delta G_{MVa}^* + \sum_M u_M u_C \Delta G_{MC}^* \quad (\text{Eq 11})$$

where Va stands for vacant interstitials and M for a substitutional element. ΔG_{MVa}^* and ΔG_{MC}^* are the hypothetical barriers for pure M and component MC , respectively. u_M and u_C are concentration variables. The final expression can be obtained per mole of atoms,

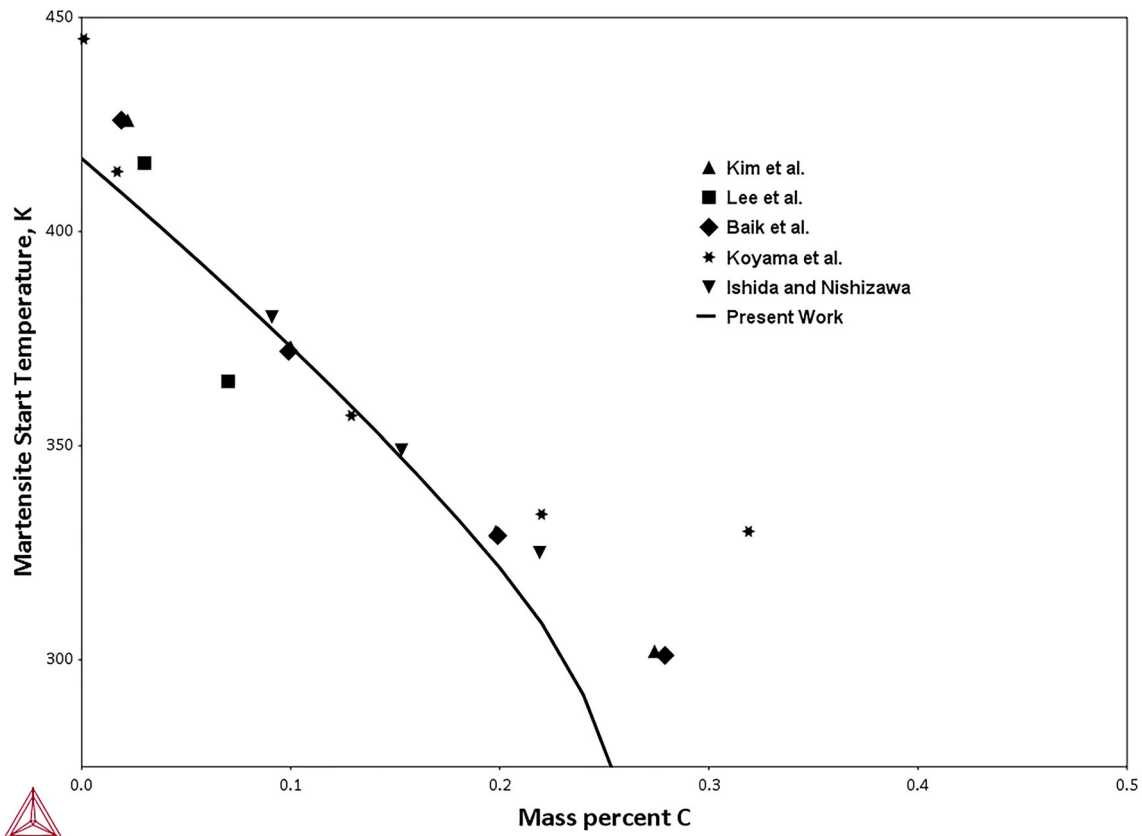


Fig. 5 Calculated M_s temperatures of $\gamma \rightarrow \varepsilon$ martensitic transformation in the Fe-17 wt.% Mn-xC system compared with the experimental data^[55–59]

$$\Delta G_m^{*\gamma \rightarrow \alpha} = \Delta G_{FeVa}^* + x_C (K_C - \Delta G_{FeVa}^*) + \sum_{M \neq Fe} x_M K_M + x_C \sum_{M \neq Fe} \frac{x_M}{1 - x_C} K_{MC} \quad (\text{Eq 12})$$

The physical meaning of the three types of coefficients is as follows,^[17] K_C denotes the change in barrier per mole of carbon atoms that is added; K_M denotes the change in the barrier when 1 mol of iron is exchanged with 1 mol of M ; and K_{MC} stands for a ternary effect when 1 mol of carbon is added at the same time as 1 mol of iron is exchanged with 1 mol of M .

According to Stormvinter,^[17] a linear superposition law was assumed for the combined effect of alloying elements on the driving force. Based on this assumption, it yields the following expressions to be applied for predicting M_s temperature of steels. To be consistent with the alloying elements in the LIGHTOUGH project, therefore, the expressions below only consider elements Fe, Mn, Al and C,

$$\Delta G_{m(Lath)}^{*\gamma \rightarrow \alpha} = 3640 - 2.92M_s + L_C^1 x_C + L_C^2 \frac{x_C^2}{(1 - x_C)} + L_{Mn}^1 x_{Mn} + L_{Al}^1 x_{Al} \quad (\text{Eq 13})$$

$$\Delta G_{m(Plate)}^{*\gamma \rightarrow \alpha} = 2100 + L_C^1 x_C + L_C^2 \frac{x_C^2}{(1 - x_C)} + L_{Mn}^1 x_{Mn} + L_{Al}^1 x_{Al} + L_{Al}^2 \frac{x_{Al}^2}{(1 - x_C)} \quad (\text{Eq 14})$$

$$\Delta G_m^{*\gamma \rightarrow \varepsilon} = C_{\epsilon} + L_C^1 x_C + L_C^2 \frac{x_C^2}{(1 - x_C)} + L_{Mn}^1 x_{Mn} + L_{Mn}^2 \frac{x_{Mn}^2}{(1 - x_C)} + L_{Mn}^3 \frac{x_{Mn}^3}{(1 - x_C)} + L_{Al}^1 x_{Al} + L_{Mn,Al}^1 \frac{x_{Mn} x_{Al}}{(1 - x_C)} + L_{Mn,C}^1 \frac{x_{Mn} x_C}{(1 - x_C)} \quad (\text{Eq 15})$$

where L_M^1 and L_M^2 ($M = \text{Mn}, \text{C}$ and Al) are the first and second order binary interaction parameters for each martensitic transformation, $L_{M,N}^1$ is the first order ternary interaction parameter in which M and N are two alloying elements in the steel and C_{ϵ} is a constant. In the present work, the interaction parameters and constant were optimised based on available experimental M_s temperatures.

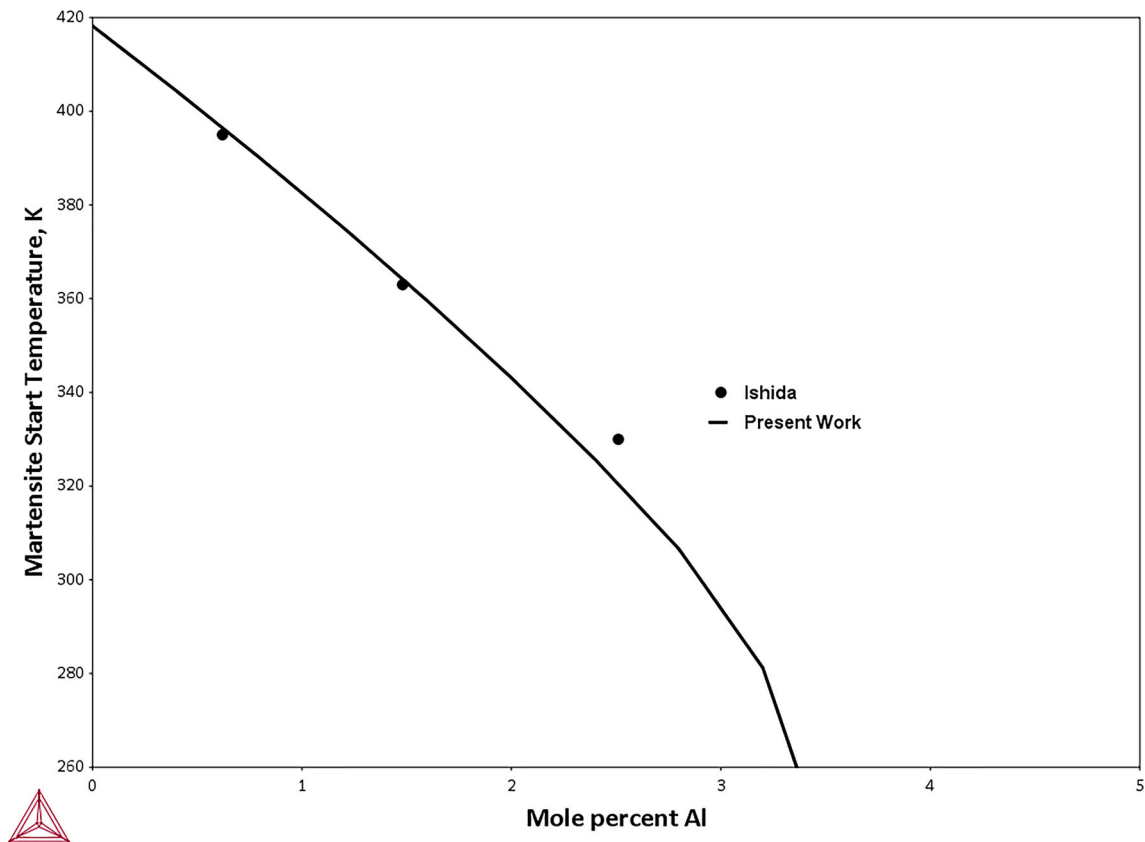


Fig. 6 Calculated M_s temperatures of $\gamma \rightarrow \varepsilon$ martensitic transformation in the Fe-17 at.% Mn- x Al system compared with the experimental data.^[59]

4 Calculations and Predictions of M_s Temperature for Selected Alloys

By using the Eq 13-15 and our thermodynamic database for the Fe-Mn-Al-C system, which have been included in the M_s property model in Thermo-Calc software,^[21] it enables finding the temperature where the available driving force for each alloy equals the required driving force or chemical barrier. Combined with a wide selection of measured M_s temperatures, the interaction parameters in the M_s property model in Thermo-Calc software^[21] were adjusted. The dilatometer measurements performed in the LIGHTOUGH project were also used to fit the model parameters. Figure 2, 3, 4, 5, 6 and 7 show the comparisons between the calculated M_s temperatures and experimental data used for optimising the binary and ternary interaction parameters. Obviously, one can observe the scattered experimental M_s temperatures, which may be attributed to different methods employed to measure M_s temperatures that bring about the difficulty in judging uncertainty limits for the reported M_s temperatures. Notwithstanding, the calculations can well reproduce the experimental M_s temperatures.

4.1 Fe-C Binary System

Based on M_s temperatures measured by Ref 46-48 and thermodynamic database created in the present work, first and second order interaction parameters in Eq 13 for lath martensite were optimised. Using the same method, the parameters in Eq 14 for plate martensite were fitted to the experimental M_s temperatures from Ref 46-49. During optimisation, more focus was placed on fitting to the experimental M_s temperatures at low carbon contents considering the significance of commercial steels. The calculated M_s temperatures for lath and plate martensites were compared with experimental data and shown in Fig. 2.

4.2 Fe-Mn Binary System

Depending on the content of Mn and the rate of cooling, different martensitic transformations take place. Upon rapid cooling, at low Mn content, γ transforms into α -martensite and at high Mn content, ε -martensite forms. By using the newly optimised parameters in the M_s model, the calculated M_s temperatures of $\gamma \rightarrow \alpha$ and $\gamma \rightarrow \varepsilon$

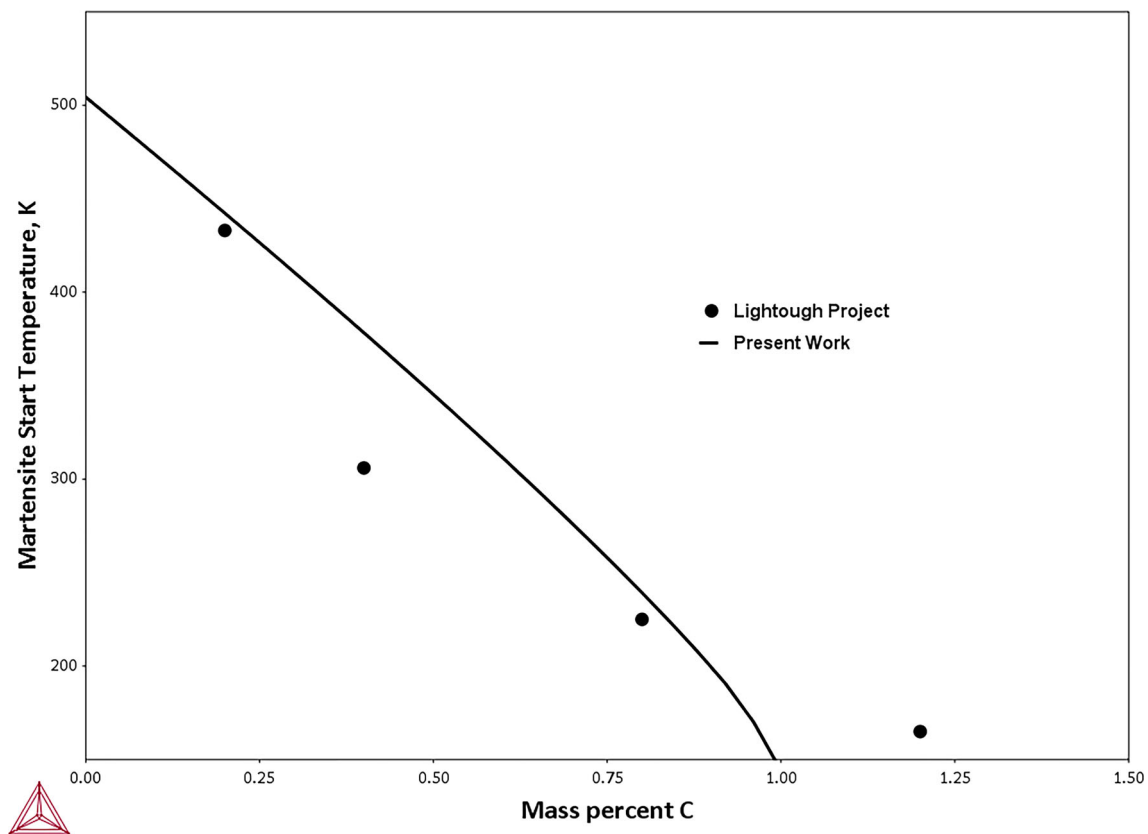


Fig. 7 Calculated M_s temperatures of $\gamma \rightarrow \varepsilon$ martensitic transformation in the Fe-10Mn-6Al-xC (wt.%) system compared with the data measured in the LIGHTOUGH project

transformations were presented in Fig. 3 and 4 along with the experimental data.^[50,51] With an increased amount of Mn, a decrease of the M_s temperature can be observed for both types of martensitic transformations. The M_s temperature of ε -martensite transformation has been extensively studied and the results show a considerable scatter. The previously measured M_s temperatures have been reviewed and compiled in the work by Cotes et al.^[51] One of the reasons for the large discrepancy is the presence of impurities. Gulyaev et al.^[52] measured the M_s temperature of ε -martensite in the Fe-Mn system using a dilatometry method and the alloys were prepared with different degrees of purity, obtained by vacuum melting and open melting, respectively. It was found that increasing the purity of Fe-Mn alloys raised the M_s temperature of the $\gamma \rightarrow \varepsilon$ transformation^[52] so that a larger quantity of ε martensite was formed. Another reason that may influence the measured M_s temperature is the measuring techniques. Cotes et al.^[51] performed an experimental study of the M_s temperature in the Fe-Mn system (10–30 wt.% Mn) by two complementary techniques, dilatometry and electrical resistivity measurements. Differences of the measured M_s temperatures were observed for the two techniques.

4.3 Fe-Mn-C and Fe-Mn-Al Ternary Systems

Fe-Mn alloys were reported to show a good damping capacity caused by forming ε -martensite upon rapid cooling,^[53,54] in which a Fe-17 wt.% Mn alloy was proved to exhibit the highest damping capacity in the Fe-Mn alloy system. Therefore, a series of studies was carried out investigating the influence of carbon on $\gamma \rightarrow \varepsilon$ transformation with the addition of carbon into Fe-17 wt.% Mn alloy.^[55–58] Additionally, Ishida and Nishizawa^[59] performed a dilatometer measurement to determine the effects of alloying elements on the M_s temperature of $\gamma \rightarrow \varepsilon$ transformation. The effect of C and Al were investigated in Fe-17 at.% Mn alloy in their work.^[59] All these experimental M_s temperatures were considered in the optimisation of interaction parameters. As shown in Fig. 5, the M_s temperatures of $\gamma \rightarrow \varepsilon$ transformation for the Fe-17 wt.% Mn-xC alloys were predicted and compared with the available measurements. A compromise was made to fit with most of the data at low carbon content due to industrial significance. In Fig. 6, the calculated M_s temperatures for the $\gamma \rightarrow \varepsilon$ transformation of Fe-17 at.% Mn-xAl is compared with experimental M_s temperatures.

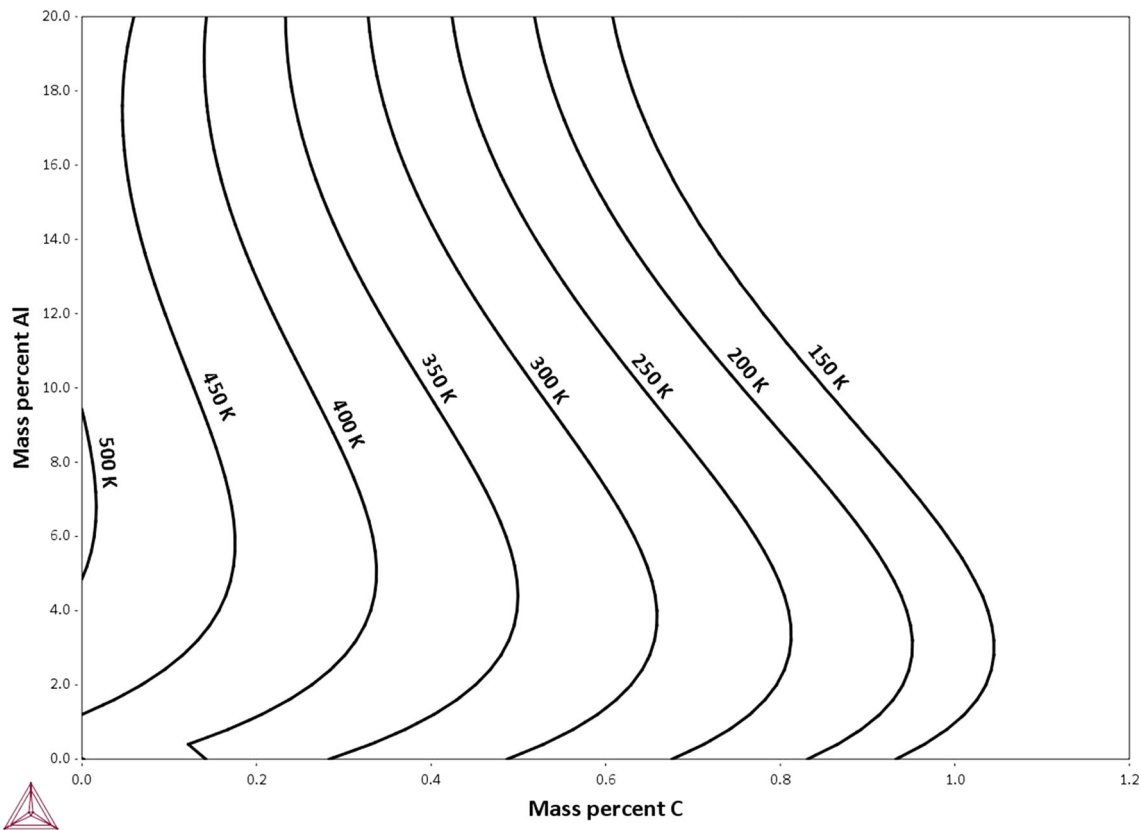


Fig. 8 Predicted M_s temperatures for the alloy of Fe-10 wt.% Mn- x Al- y C

4.4 Fe-Mn-Al-C

Within the LIGHTOUGH project, dilatometry experiments were carried out on a selection of alloys, Fe-10Mn- x Al- y C ($x = 3, 6, 9$ and 12 wt.%, and $y = 0, 0.2, 0.4, 0.8$ and 1.2 wt.%). Fast cooling to cryogenic temperatures was performed with the aim at detecting the M_s temperatures. The thermal cycle employed is listed below,

- Slow heating to 1150 °C at 1 °C/s, to observe heating transformations.
- The soaking period at 1150 °C for 2 min. It is assumed that after soaking for 2 min at 1150 °C, that pseudo-equilibrium has been reached.
- Slow cooling to room temperature at -1 °C/s, to observe cooling transformations.
- Reheating to 1150 °C at 10 °C/s.
- Soaking for 2 min.
- Fast cooling at -100 °C/s (or as fast as possible given the machine limitations) with liquid nitrogen to -180 °C, to force martensitic transformation if feasible.

Great difficulties were encountered in interpreting the dilatation effect in the dilatometry curves of the selected alloys. The dilatation in the curves was too small to

pinpoint the exact start temperatures for the selected alloys. Only for the alloy group of Fe-10Mn-6Al- y C (wt.%), the transformation was clearly observed and considered in the current optimisation. The calculated results are shown and compared the experimental data in Fig. 7. Based on the optimised model parameters for the Fe-Mn-Al-C system, M_s temperatures for the alloys, Fe-(10, 20 and 30 wt.%)Mn- x Al- y C, were predicted. Further experimental information is needed to improve the predictability of the current available parameters.

5 Discussion

When predicting M_s temperatures of a steel, one should use the same thermodynamic database which was adopted when deriving the expression of the required driving force. Otherwise, we would produce meaningless predictions. When the thermodynamic database is updated, the coefficients of alloying elements in the driving force should be re-evaluated accordingly. As has been emphasised by Stormvinter et al.,^[17] this rule is common to all the models that are linked with thermodynamic databases. Additionally, it should be addressed that the expressions of required driving force in the present work and the work by

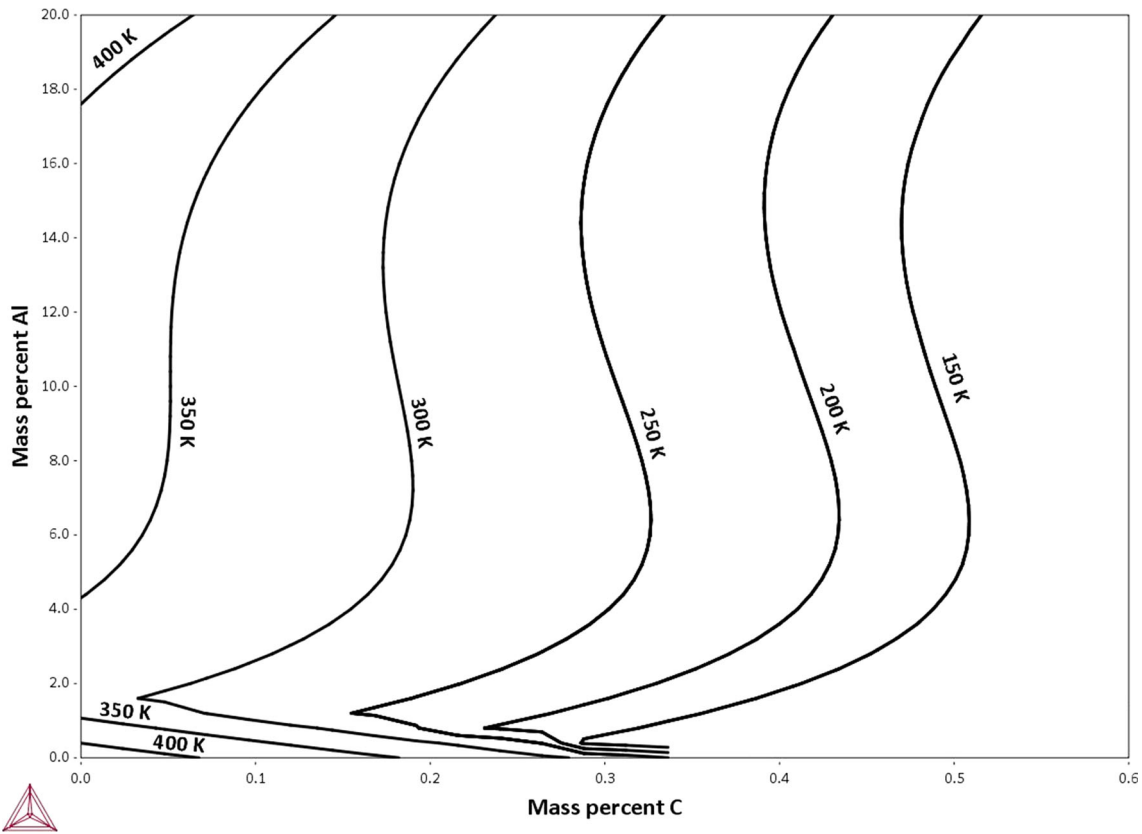


Fig. 9 Predicted M_s temperatures for the alloy of Fe-15 wt.% Mn- x Al- y C

Stormvinter et al.^[17] are all based on the expressions for pure Fe.^[40] Accordingly, the description of the critical driving force of pure Fe largely determines the effects of alloying elements and then the final predictions of M_s temperatures.

A discontinuous variation of martensitic transformation with increased cooling rate in several alloying systems was reviewed by Stormvinter et al.^[17] that the transition from plateau III to IV with the increased cooling rate in iron was reported. In the work by Mirzayev et al.^[60] and Wilson,^[61] the transition from plateau III to IV was discussed and interpreted as the formation of lath and plate martensites. The present prediction of M_s temperatures was based on the models proposed by Stormvinter et al.,^[17] who was the first to consider this phenomenon and derive two separate expressions (13) and (14) for transformation barrier.

The complexity of martensitic transformation, scarce availability of experimental M_s temperatures and uncertainty of thermodynamic database at low temperature make it challenging when performing prediction of M_s temperature. In the Fig. 8, 9 and 10, for the prediction of M_s temperatures in the quaternary system of Fe-Mn-Al-C, a general trend was predicted. However, due to lack of experimental data, we had the challenge to validate the predictability. It would be interesting to have more data to

assist the validation work. Another problem is that the current thermodynamic databases are not valid down to 0 K. Thus, it is challenging to predict the M_s temperatures for the alloys with high Mn and Al contents, which indicate low M_s temperatures or even close to the absolute zero point.

6 Conclusions

A tailor-made thermodynamic database for the Fe-Mn-Al-C system was developed within the LIGHTOUGH project. Thermodynamic descriptions of fcc, bcc and kappa in the database were improved. Based on the database and available experimental M_s temperatures, the model parameters in the M_s property model in the Thermo-Calc software^[21] were optimised. Experimental M_s temperatures of Fe-C, Fe-Mn binary systems and some alloys in Fe-Mn-C and Fe-Mn-Al ternary systems were well reproduced by the calculations using the newly evaluated parameters. Additional experimental M_s temperatures for the Fe-Mn-Al-C quaternary system are needed to further optimise the description. The current thermodynamically based semi-empirical method may be the best available approach for the prediction of M_s temperatures.

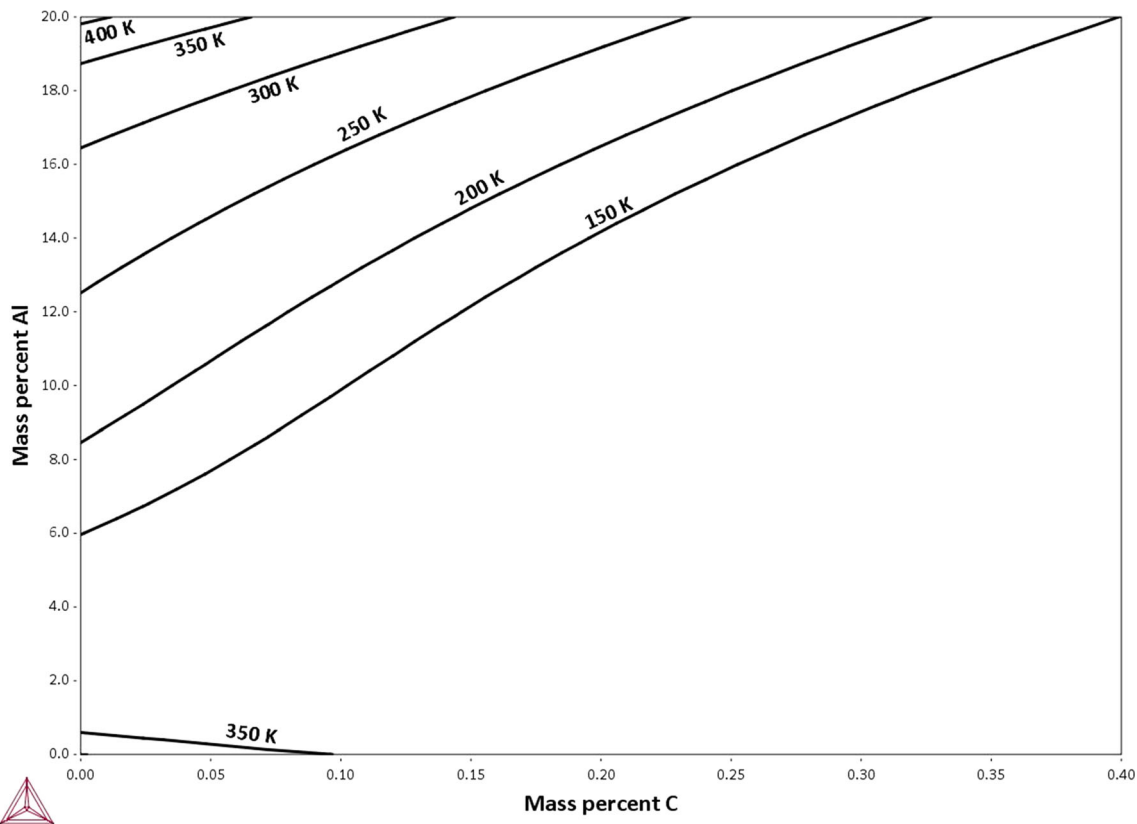


Fig. 10 Predicted M_s temperatures for the alloy of Fe-20 wt.% Mn-xAl-yC

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