Design methodology for functionally graded materials: framework for considering cracking

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Abstract

In functionally graded materials (FGMs) fabricated using directed energy deposition (DED) additive manufacturing (AM), cracks may form due to interdendritic stress during solidification, the formation of intermetallics, or the buildup of residual stresses. This study builds on our previously proposed concept of three-alloy FGM system feasibility diagrams for the identification of gradient pathways that avoid deleterious phases in FGMs by also considering solidification cracking. Here, five solidification cracking criteria were integrated into the feasibility diagrams, and equilibrium simulations were carried out based on Scheil results (termed Scheil-equilibrium simulation) to predict phase formation below the solidus temperature considering solidification microsegregation. The new feasibility diagrams were applied to four previously studied FGM systems, and the newly proposed approach predicted high crack susceptibility, detrimental phase formation, or interdendritic BCC phase formation in the experimentally observed cracking region. This demonstrates the utility of the proposed framework for crack prediction in the design of future FGMs gradient pathways.

Keywords:

Functionally graded material; CALPHAD modeling; hot cracking; crack susceptibility; additive manufacturing

1. Introduction

Functionally graded materials (FGMs) are those in which structure or composition varies with position to serve under extreme conditions, such as those common to the nuclear power generation, aerospace, and maritime sectors [1]–[4]. FGMs can be used as an approach to join dissimilar metals that cannot otherwise be welded directly, such as stainless steel 304L (SS304L) and Ti-6AI-4V, by introducing nonlinear composition paths or the addition of intermediate elements or alloys to circumvent the forming of deleterious phases [5]. FGMs also enable the spatial tailoring of properties within a component; for example, a gradient region between ferritic and austenitic alloys that avoids failure normally occurring due to carbon diffusion during service [6]. The powder-based directed energy deposition (DED) additive manufacturing (AM) process has been used to fabricate FGMs through the deposition of varying mixtures of powder feedstock into the melt pool created by the laser during processing [7]. However, fabricating crack-free and robust FGMs requires avoiding compositions and processing conditions where cracks will form, which is cost-prohibitive with trial-and-error, highlighting the importance of computational tools to guide FGM design.

Previous studies have shown that FGMs made by DED AM often result in cracking [8]– [10], due to intermetallic phase formation, solidification cracking, or residual stress buildup. For example, the study of FGMs from SS304L to Ti-6A1-4V with V as an intermediate showed that the presence of Fe-Ti intermetallic phases and σ phase resulted in cracking in the gradient regions [11]. Similarly, delamination was reported in FGMs from Ti-6A1-4V to Inconel 718 (IN718) due to intermetallic phases and a coefficient of thermal expansion (CTE) mismatch between the two terminal alloys [12], and cracks were found in Ti-6A1-4V to stainless steel FGMs due to limited miscibility between the alloys, intermetallic phase formation, and residual stress [13].

CALPHAD (CALculation of PHAse Diagrams) modeling has been used to predict the formation of potentially deleterious phases during AM, with this insight used to design composition pathways that avoid these phases. The present authors proposed the concept of feasibility maps for ternary systems to aid in avoiding regions with high deleterious phase fractions, as predicted through either equilibrium simulations or Scheil solidification simulations [5]. With this approach, a stainless steel 316 (SS316) to Ti-6Al-4V FGM with Ni-20Cr, Cr, and V as intermediate alloys was designed, fabricated, and confirmed to contain no detrimental phases. Other researchers have developed a path finding algorithm to identify composition pathways in high dimensional composition spaces that avoid deleterious phase formation within FGMs based on equilibrium simulations, with a later improved path finding algorithm to search the composition space more comprehensively and generate smoother compositional routes [14]–[16]. However, avoidance of brittle phase formation is not sufficient for crack-free FGMs. Cracking has been reported for FGMs in which the amounts of deleterious phases were low or zero, e.g., stainless steel to Inconel FGMs [17]-[19], SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V FGMs [5], and SS304L to Ni-20Cr FGMs [20]. This highlights the fact that the solidification process and crack susceptibility need also to be considered when designing FGM pathways.

Solidification cracking, liquation cracking, and cracking due to thermal stress buildup can occur in FGMs fabricated by DED AM. Hot tearing can occur during fabrication, including solidification cracking due to interdendritic stress or lack of liquid backfilling during solidification shrinkage and liquation cracking due to remelting of low-melting-temperature components in previous layers [21]. The thermal stresses present during AM fabrication from the material contraction upon solidification followed by expansion and contraction with thermal cycles are exacerbated in FGMs due to mismatched coefficients of thermal expansion between phases within layers or between layers of differing compositions.

While AM processes and materials present new challenges for crack susceptibility models, their development in the context of traditional casting and welding processes is relatively wellestablished. For example, research on stainless steels has demonstrated the effect of solidification mode, ferrite amount, and impurities on crack susceptibility. A low ferrite level (<5%) and a high ferrite level (>20%) were found to increase solidification crack susceptibility [22]. Austenite (A) and austenite-ferrite (A-F) solidification modes were found to be more susceptible to solidification cracking than ferrite-austenite (F-A) and ferrite (F) solidification modes [22]. Impurities such as P and S and alloy elements such as Ti, Nb, N were found to form compounds and eutectics, which increased solidification crack susceptibility [23]. Models to predict hot cracking in welding processes were applied to the development of Nickel alloys for additive manufacturing, including the freezing range (FR) model, where only the temperature drop during solidification is considered, the crack susceptibility coefficient (CSC) model, based on the relative time spent in crack susceptible solidification region, and the Kou criterion, where the lateral growth rate of dendrites and grains is considered [24]. The Rappaz-Drezet-Gramaud (RDG) model considers interdendritic pressure change due to solidification shrinkage and mechanical deformation, calculating a critical deformation rate to represent crack susceptibility [25]. The RDG model requires material properties and solidification

conditions as discussed in the next section. To obtain a simplified solidification crack susceptibility indicator based only on the solidification path, Easton et al. [26] proposed an indicator that only considered the pressure drop due to liquid shrinkage in the RDG model, here referred to as the simplified RDG or sRDG criterion, and also provided an improvement for the CSC criterion, here referred to as the improved CSC or iCSC criterion, to focus on the end of the solidification process.

This paper provides a framework for considering both deleterious phase formation and crack susceptibility in designing gradient paths for FGMs to be fabricated by AM. The FR, CSC, Kou, simplified RDG (sRDG), and improved CSC (iCSC) criteria were used to calculate crack susceptibility as a function of composition, and equilibrium and Scheil simulations were used to predict phase formation. Furthermore, instead of using elemental ternary systems as a simplification of the alloy systems, ternary FGM feasibility maps with alloy compositions were calculated to aid in the visualization of deleterious phase formation and crack susceptibility within multi-alloy systems. The proposed approach for evaluating compositional feasibility was applied to previously studied FGMs, including SS304L to Inconel 625 (IN625) [17], SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V [5], SS304L to Ni-20Cr [20], and Ti-6Al-4V to Invar [27], comparing the computational predictions with experimentally observed compositions where cracking occurred. We also carried out equilibrium simulations using Scheil results to show how microsegregation during the AM process affected FCC-BCC phase transformation in the SS304L to Ni-20Cr FGMs, which explained the cracks in the corresponding sample. The framework for creating comprehensive feasibility diagrams presented herein provides a tool for designing gradient pathways for FGMs fabricated with DED AM.

2. Experimental methods

The following four FGMs that were previously fabricated and analyzed were examined here: SS304L to IN625 [17], SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V [5], Ti-6Al-4V to Invar [27], and SS304L to Ni-20Cr [20]. All these FGMs were fabricated using DED AM by changing the volume fraction of two different powder feedstocks as a function of vertical position. Details of the gradient paths, DED process parameters, and characterization methods are available in previous publications. In the present work, energy-dispersive X-ray spectroscopy (EDS) analysis was performed in a scanning electron microscope (SEM, Thermo-Scientific, Apreo S) with a silicon drift detector attachment (Oxford Instruments, Ultim Max silicon drift detector) to measure compositions in the crack region of the SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V FGM. All other experimental data presented here are from the corresponding previously published papers.

3. CALPHAD methods

The CALPHAD approach enables the simulations of multi-component multi-phase behavior in complex systems by modeling thermodynamic properties for each phase [28]. Equilibrium simulations define phases present as a function of composition and temperature at equilibrium or infinite times or infinite diffusion rates in all phases. The Scheil-Gulliver solidification model can be used to predict the amounts of phases formed during the solidification process by assuming an infinite diffusion rate and thus homogenous composition in the liquid, negligible diffusion in the solid, and local equilibrium at the solid/liquid interface [29][30]. Equilibrium and Scheil simulations based on the CALPHAD method were used in the present work to predict phase formation under two extreme conditions. The improved feasibility maps proposed here provide a visualization of composition regions anticipated to result in deleterious phases or high crack susceptibility within FGMs by merging of maps of deleterious phase predictions (via equilibrium and Scheil solidification simulations) and susceptibility of solidification cracking.

To create the deleterious phase feasibility maps, Scheil simulations were performed for each composition to predict phase formation during rapid solidification [31]. Additionally, the solidus temperature as a function of composition was extracted from Scheil simulations. Equilibrium simulations were performed over a temperature range from $\frac{2}{3}$ T_s to T_s, where T_s is the solidus temperature for each composition. This temperature range was selected to predict phase formation during deposition, with the assumption that below $\frac{2}{3}$ T_s, phase transformations are kinetically frozen out [32]. The feasibility of each composition was determined by comparing the total amount of predicted deleterious topologically close packed (TCP) phases with a user-defined threshold, where the amount of deleterious phase in the equilibrium results was determined by summing the deleterious phase fractions at each temperature and taking the highest amount within the temperature range, while the amount of deleterious phase in Scheil simulations was taken directly from the Scheil simulation results.

The solidification process can be divided into four stages [23]: (1) nucleation, where the liquid phase is continuous, with dispersed solid nuclei; (2) the growth of solid phase while liquid can still move and fill in cracks; (3) further growth of the solid phase resulting in the disruption of liquid passages such that the dispersed liquid cannot fill voids, which is the highest crack susceptibility stage; and (4) finally, the end of the solidification process when liquid phase completely disappears. Here, we evaluated composition maps in terms of five

crack susceptibility criteria, as shown in **Figure 1**. In each case, the crack susceptibility criteria used the temperature versus solid fraction curves generated from Scheil simulations, where most of the criteria evaluated focus on the third stage of the solidification process.

The freezing range (FR) criterion, which considers the difference between the liquidus temperature (T_L) and solidus temperature (T_s) , is given by:

$$FR = \Delta T = T_L - T_S. \tag{1}$$

Higher values of FR indicate that the composition will remain in the mushy zone over a larger temperature range, corresponding to a higher possibility to form harmful interdendritic phases than a material with a small FR.

The CSC criterion, which considers the ratio of time in the third solidification stage to that in the second solidification stage, is given by:

$$CSC = \frac{t_{f_S=X_1} - t_{f_S=X_2}}{t_{f_S=X_2} - t_{f_S=X_3}} \approx \frac{T_{f_S=X_1} - T_{f_S=X_2}}{T_{f_S=X_2} - T_{f_S=X_3}},$$
(2)

where $t_{f_s=X_i}$ and $T_{f_s=X_i}$ are the time and temperature when the solid fraction equals X_i, and i=1,2,3, respectively. The temperature-based ratio is used here, with the values of X₁, X₂, and X₃ taken to be 0.99, 0.9, and 0.4, as in ref. [24]. A large value of CSC indicates a large fraction of time in the solidification process during which cracks cannot be healed by liquid filling, resulting in a high crack susceptibility. In Scheil simulations, equilibrium is assumed at the solid/liquid interface, so solute atoms may be rejected from the solid and concentrate in the remaining liquid during solidification, bringing the composition of the liquid closer to the eutectic composition. From a modeling perspective, eutectic reactions at the very end of the solidification process can result in higher CSC values than those occurring at earlier stages, (i.e., $T_{f_s=X_1} - T_{f_s=X_2}$ is larger). If the eutectic solidification happens before $f_s = X_2$, then the CSC value will be 0, indicating no cracking susceptibility. From a physical perspective, the complicated three-dimensional network structure in eutectic microstructure can suppress crack formation and growth, and if there are brittle phases and ductile phases at the same time, the crack generated in the brittle phase may be arrested when entering the ductile phase [33]–[35]. However, when the eutectic reaction occurs at the end of the solidification process, the rapid solidification of the remaining interdendritic liquid will result in significant stresses and voids that have no chance of being healed. Besides solidification cracking, eutectic structures forming at the very end of the solidification process usually have a much lower melting temperature than the matrix, which can cause liquation cracking during subsequent laser passes during AM fabrication or post-process heat treatment. An issue with the CSC criterion is that if eutectic solidification happens before X_3 (here a solid fraction < 0.4), the CSC value becomes undefined. In this case, the CSC value was taken to be zero, as a large amount of eutectic structure is expected to inhibit solidification cracking as discussed above [33]–[35].

The iCSC criterion, which integrates the solid fraction as a function of temperature within the third stage of the solidification process is given as:

$$iCSC = \int_{T_{f_s=X_1}}^{T_{f_s=X_2}} f_s(T) dT,$$
 (3)

where X_1 and X_2 were taken to be 0.7 and 0.98 here, the same as in ref. [26]. Compared to the CSC model, the iCSC criterion focuses on the end of the solidification process, where liquid filling to heal voids is limited and crack susceptibility is the highest.

The sRDG criterion is calculated as:

$$sRDG = \int_{T_{f_s=X_1}}^{T_{f_s=X_2}} \frac{f_s(T)^2}{(1-f_s(T))^2} dT,$$
(4)

where X1 and X2 were taken to be 0.7 and 0.98 here, the same as in ref. [26]. The sRDG criterion

modifies the RDG model by considering a simplification of its term describing the pressure change due to solidification shrinkage. Unlike the RDG criterion, where materials properties (e.g., liquid viscosity, liquid and solid density) and solidification conditions (e.g., temperature gradient, secondary dendrite arm spacing) are required, Easton et al. [26] proposed the sRDG criterion, which can be calculated directly from Scheil simulations, making it more suitable for alloy development, where properties of new compositions are unknown.

The Kou criterion represents the inverse of the speed of the lateral growth of dendrites and grains at the end of the solidification process as shown below:

$$Kou = \left| \frac{dT}{d \left(f_s^{\frac{1}{2}} \right)} \right|_{f_s^{\frac{1}{2}} \to 1} \approx \left| \frac{T_{f_s = X_1} - T_{f_s = X_2}}{\sqrt{X_1} - \sqrt{X_2}} \right|,$$
(5)

where X_1 and X_2 were taken to be 0.98 and 0.93 here, higher than the values used by Yu et al. [24] to consider the behavior near the end of solidification. A high value of the Kou criterion indicates a slow lateral growth that would result in long interdendritic with intergranular liquid channels susceptible to crack formation.



Figure 1: Schematics for calculating the five cracking criteria with T for temperature and fs for solid fraction: (a) FR is the temperature difference between liquidus and solidus temperature, (b) CSC is the ratio of the time for the third solidification stage over the second solidification stage, (c) Kou is the absolute value of the slope of the T vs. $\sqrt{f_s}$ curve near the end of the solidification process, (d) iCSC is the area under the f_s vs. T curve during the third stage of solidification, (e) sRDG is the area under the $\frac{f_s^2}{(1-f_s)^2}$ vs. T curve during the third stage of solidification, where the end of the solidification process is emphasized more than in the iCSC criterion.

For all five criteria considered here, a larger value indicates a higher likelihood of solidification cracking. In addition to solidification cracking, solid-state phase transformation during cooling in AM can introduce thermal stresses and result in cracking. However, as Scheil simulations only consider the solidification process, they cannot predict phase formation at temperatures below the solidus temperature, and equilibrium simulations use the overall composition of the layer to compute formation of phases, neglecting possible phase transformations due to microsegregation. To investigate solid-state phase transformations in interdendritic or intergranular regions during solidification, we propose to compute the phase

equilibrium as a function of local, micro-segregated local compositions from Scheil simulations, here termed 'Scheil-equilibrium simulation'. Phase fractions predicted in the simulations considering solidification microsegregation in the SS304L to Ni-20Cr FGM sample using the FEDEMO database from Thermo-Calc [36] are plotted in **Figure 2**. As shown in **Figure 2 (a)**, the Scheil simulation was first performed using the overall composition of each layer, and the predicted solid composition at the solidification interface was plotted as a function of solid fraction. Equilibrium simulations were then carried out for each composition along the Scheil simulation curves, and thus the predicted phase fractions at 700 °C were plotted as a function of solid fraction in **Figure 2 (b)**. The area below the curve for each phase in **Figure 2 (b)** corresponds to the overall fraction of that phase.

By repeating the Scheil and equilibrium simulations for each composition in the gradient region, the expected phases at 700 °C, considering microsegregation, for the SS304L to Ni-20Cr FGM are shown in **Figure 2 (c)**. Compared to Scheil simulations and equilibrium simulations at 700 °C using the overall layer compositions, where no BCC phase formation was predicted, the results here match better the X-ray diffraction (XRD) and electron backscatter diffraction (EBSD) results from ref. [20]. The Scheil results in **Figure 2 (a)** show an increase of Cr concentration at the end of solidification, favoring the formation of the BCC phase, which was ignored in the equilibrium simulations using layer compositions. Compared to kinetic simulation modules like DICTRA and TC-PRISMA in the commercial software Thermo-Calc [36], the Scheil-equilibrium simulation does not take diffusion into consideration. However, this proposed framework does not require mobility databases and, considering that the high cooling rate of AM processing limits the effects of diffusion, the Scheil-equilibrium

simulation offers a simple way to predict amounts of phases considering solidification microsegregation in AM.



Figure 2: Plots showing how to perform the Scheil-equilibrium simulation: (a) Scheilpredicted composition of the solid at the solid/liquid interface as a function of solid fraction based on the overall composition of a layer, (b) equilibrium phase predictions at 700 °C for each composition shown in (a), where the area beneath each curve corresponds to the total mole fraction of the corresponding phase for that layer composition, and (c) phase distribution along the SS304L-NiCr gradient region at 700 °C following the procedure outlined in (a)-(b) for each layer of the FGM (EDS composition can be found in ref. [20]).

4. Results and Discussion

4.1 SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V

Previous Scheil and equilibrium deleterious phase feasibility maps showed no brittle TCP phases along the SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V composition path [5]. However, micro-cracks were observed near the pure Cr region, extending into the Ni-20Cr + Cr and Cr + V regions. **Figure 3 (b)** and **(d)** show an increase in Ni concentration near the crack. Because here Ni was being pushed from solid into liquid during solidification as discussed below, i.e., the later the region solidified, the higher the Ni concentration, the increase of Ni concentration near the crack indicates that cracking occurred in the region that solidified last and was vulnerable to solidification cracking. Equilibrium and Scheil simulations were carried out for

the Cr-Ni-V system using a newly development Al-Cr-Fe-Ni-Ti-V database. All five crack susceptibility criteria showed a peak value near the pure Cr region in the SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V FGM as shown in **Error! Reference source not found.**



Figure 3: EDS maps showing the distribution of Ni and V near the cracks in the SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V FGMs [5] for regions with ~87 wt% Cr, 12 wt% Ni and 1 wt% V: (a) SEM image around the crack, (b) Ni distribution map for the region in (a), (c) V distribution map for the region in yellow rectangle in (a) showing that the particles from the above layers mentioned in ref. [5] contributed to the cracking too , and (d) Ni and Cr concentrations along the yellow line in (a) shows an increase of Ni concentration near the crack, indicating the crack happens at the end of the solidification process.



Figure 4: Normalized crack susceptibility calculated using experimentally measured composition in the Ni-20Cr-Cr-V region of the SS316 to Ni-20Cr to Cr to V to Ti-6Al-4V FGMs (EDS composition can be found in ref. [5]), where the red "X" symbols indicate where cracks were seen experimentally (see **Figure 3**).

In the Cr-Ni binary system, the peak in the crack susceptibility criteria is due to the steepness of the liquidus (i.e., large $\frac{\Delta T}{\Delta c(NI)}$, where c(Ni) is Ni concentration) and the large solid-liquid equilibrium region (i.e., large difference between T_s and T_L) at the Cr-rich side, indicating a drastic increase in Ni concentration in the remaining liquid with increasing solid fraction, and a large temperature drop during the solidification process, which were captured by the crack susceptibility criteria. As the Ni concentration increased in the remaining liquid, its composition eventually allowed for a eutectic reaction. The further the initial composition is away from the eutectic composition (~49 wt% Ni and 51 wt% Cr), the later the eutectic reaction happens during solidification, which, as discussed in the previous section, increases crack susceptibility. The actual sample is more complicated than the pure Ni-Cr system, as evidenced by the particles and the small amount of V that were found in the cracked region (shown in **Figure 3**). Adding V into the Ni-Cr system suppressed the terminal eutectic reaction, letting the temperature further drop at the end of the solidification process and increasing crack

susceptibility. The particles detected in the crack shown in **Figure 3 (a)** and **(c)** were reported Bobbio et al. [5] to be particles with high liquidus temperature from the above layers. It is possible that concentrated thermal stress around these particles initiated cracks during cooling.

The Cr-Ni-V ternary system is used here as an example to demonstrate the FGM design process using the newly proposed feasibility diagrams. **Figure 5** shows the equilibrium and Scheil feasibility maps for this system, and the phases in **Figure 5** (**b-c**) depict that a direct path from Ni to V is obstructed by the σ phase region in the middle. From the point of view of avoiding deleterious phases, the composition path should be designed near the Ni-Cr and Cr-V boundaries. However, **Figure 6** shows the crack susceptibility maps for the Cr-Ni-V system, where all five criteria studied have large values near the Cr corner. If deleterious phases and crack susceptibility are considered simultaneously (see **Figure 7**), all the paths from the Ni corner to the V corner are infeasible, and an intermediate element or alloy must be considered. If routing composition through the crack susceptible region is necessary, the building process must be optimized, for example, by adding secondary laser scans or baseplate heating to reduce the cooling rate [37][38].



Figure 5: Scheil and Equilibrium simulation results for the Cr-Ni-V ternary system, where the W shown on the axis represents weight fraction. (a) Feasibility diagram considering deleterious phase formation for the Cr-Ni-V ternary system calculated, where equilibrium simulations were performed from $\frac{2}{3}$ T_s to T_s, and the deleterious phase threshold was taken to be 10 mela% for equilibrium and 5 mela % for Scheil. (b) Example of equilibrium

be 10 mole% for equilibrium and 5 mole % for Scheil. (b) Example of equilibrium deleterious phases' distribution in the Cr-Ni-V system at 800 °C. (c) Phase distributions predicted by Scheil simulations, where σ is considered as a detrimental phase.



Figure 6: Normalized crack-susceptibility maps for the Cr-Ni-V system using the five crack-susceptibility criteria, where the W on the axis represents weight fraction.



Figure 7: Newly proposed feasibility diagrams showing regions to avoid during DED FGM fabrication due to deleterious phases superimposed with regions to avoid due to crack susceptibility, where the W on the axis represents weight fraction.

4.2 SS304L to Ni-20Cr to IN625

Crack susceptibility maps can also be calculated for three-alloy FGM systems. **Figure 8** shows crack susceptibility maps for the SS304L-(Ni-20Cr)-IN625 system simulated with a newly developed Cr-Fe-Nb-Ni-Mo database, with compositions simplified to be the Cr-Fe-Mo-Nb-Ni system, and neglecting elements C, Mn, Si, Co, Ti, and Al due to their small amounts and database limitations. The deleterious feasibility map in **Figure 8 (a)** shows that amounts of deleterious phases from both equilibrium and Scheil simulations are under the user-defined thresholds (10 mole% for equilibrium and 5 mole% for Scheil). The crack susceptibility maps show that a linear gradient from SS304L to IN625 is likely to encounter solidification cracking,

while if some Ni-20Cr is added in the gradient region, e.g., using a three-powder feeder system or using premixed powder, the high crack-susceptibility region can be avoided.



Figure 8: (a) Feasibility diagram considering deleterious phase formation for the SS304L-(Ni-20Cr)-IN625 system (simplified as a Cr-Fe-Mo-Nb-Ni multi-component), where equilibrium simulations were performed from $\frac{2}{3}T_s$ to T_s , and the deleterious phase threshold was taken to be 10 mole% for equilibrium and 5 mole% for Scheil. The W on the axis represents weight fraction. (b) Normalized crack susceptibility maps based on the five criteria studied, where the W on the axis represents weight fraction.

4.2.1 SS304L to IN625

Figure 9 shows the crack susceptibility along the SS304L-IN625 gradient path extracted from the three-alloy FGM system shown in **Figure 8 (b)** with the regions with experimentally observed cracking indicated. The previous analysis for this FGM showed only a trace amount of deleterious phase in the gradient region; however, cracking has been widely observed in stainless steel and Inconel joining [7], [17]–[19].



Figure 9: Normalized crack susceptibility criteria along the SS304L-IN625 gradient pathway extracted from Figure 8, where the red "X" symbols indicate where cracks were observed experimentally [17].

According to the Schaeffler diagram [39] and the WRC-92 constitution diagram [40], an increase in Ni concentration reduces the ferrite fraction and push the solidification mode from ferrite-austenite (F-A) mode to austenite-ferrite (A-F) mode and further to austenite (A) mode. Previous study reported that A and A-F solidification modes are more susceptible to solidification cracking than F-A, and that the crack susceptibility increases rapidly when the ferrite level is lower than 5% [22]. In the SS304L-IN625 FGM, a lathy ferrite phase was

observed in the SS304L region, indicating an F-A solidification mode. In the SS304L-IN625 gradient region, with increased Ni from IN625, the solidification mode transformed to A-F, and the ferrite phase fraction decreased, resulting in solidification cracking in the gradient region.

Error! Reference source not found. (a) shows liquidus and solidus temperatures, and Error! Reference source not found. (b) shows phases from Scheil simulations using EDS composition data for the SS304L-IN625 FGM from ref. [17], where a dramatic solidus temperature drop and increase in Laves C14 phase fraction were shown at the beginning of the gradient region. The crack susceptibility criteria captured the decrease of temperature at the end of solidification, where precipitates formed, resulting in the high crack susceptibility along the SS304L-IN625 boundary as shown in Figure 8. The experimentally observed cracking occurred with 21 wt% IN625, while the most crack susceptible region predicted in Figure 9 corresponded to 7.7 wt% IN625 (FR and CSC criteria) and 15.3 wt% IN625 (Kou, iCSC and sRDG criteria). The reason for this discrepancy is the poor precision of Scheil simulations towards the conclusion of the solidification process, particularly when conducting simulations for multi-component systems with significant microsegregation. This is due to microsegregation potentially pushing the composition into a region that was not optimized in the database, along with the assumption of zero diffusion in the solid. The CSC criterion and Kou criterion predicted another crack susceptible region near the IN625 composition, but no cracks were experimentally observed there. Kinetic simulations in ref. [41] showed that metastable γ'' phase forms before δ phase in the interdendritic regions of IN625, which may have occurred in this sample, such that interdendritic metastable γ'' phase formed in the IN625rich regions instead of the δ phase which Scheil simulations predicted to form. This points to

a limitation of the current crack susceptibility diagrams in that they do not consider metastable phases.



Figure 10: Scheil simulations for the designed composition of the linearly graded SS304L to IN625 FGM [17]: (a) solidus and liquidus temperatures showing a dramatic solidus temperature drop in the gradient region, (b) Scheil-predicted phase fractions, showing the formation of Laves C14 phase on the SS304L-rich side of the gradient region.

4.2.2 SS304L to Ni-20Cr

No formation of deleterious phases was predicted in the SS304L to Ni-20Cr FGM, and **Figure 11** shows the crack susceptibility along the SS304L to Ni-20Cr FGM extracted from **Figure 8**, which suggests a much lower crack susceptibility compared to that for the SS304L-IN625 path. While no micro-cracks were experimentally observed, a macro-scale crack was observed in the sample from the middle of the gradient region to the top of the Ni-20Cr region [20]. XRD data and EBSD maps in previous publications showed FCC phase (in Fe-rich cellular regions) and BCC phase (in Cr-rich inter-cellular regions) in the Ni-20Cr-rich gradient region, indicating that the macro-scale crack could be the result of the formation of a brittle BCC phase and thermal stresses between FCC and BCC phases during the cooling process.

However, the Scheil simulation carried out in the previous publication showed only an FCC phase in the Ni-20Cr-rich region and the equilibrium simulation predicted a very low amount (< 0.1 mol%) of BCC phase formation below 600 °C. BCC phase was detected in the sample because Cr was pushed into the liquid during the solidification process (see Figure 2 (a)), and the resultant higher interdendritic Cr concentration favored the formation of BCC phase. Because Scheil simulations end at the solidus temperature, and the equilibrium simulations using the overall layer composition ignores Cr microsegregation, the formation of BCC phase was underestimated in previous simulations. Error! Reference source not found. shows a comparison of results using overall layer compositions (Error! Reference source not found. (a)) and the current Scheil-equilibrium simulations (Error! Reference source not found. (b)). for the SS304L to Ni-20Cr FGM. The Scheil-equilibrium method predicted the BCC phase to form in the 50% Ni-20Cr region at 900 °C, reaching up to ~5 mole% at 600 °C, while the equilibrium simulation predicted the BCC phase to form in the same region at 650 °C, reaching up to only ~0.1 mole% at 500°C. If this low amount of BCC were present, this is not detectable by XRD or EBSD in ref. [20]. The Scheil-equilibrium simulation predicted the BCC phase formation due to the Cr-microsegregation here better than either the Scheil or equilibrium simulations alone.



Figure 11: Normalized crack susceptibility criteria along the SS304L to Ni-20Cr gradient pathway extracted from Figure 8 [20], where the lack of red X marks indicates no (microscale) solidification cracking was observed experimentally.



Figure 12: Predicted fraction of BCC phase in the SS304L-Ni-20Cr FGM at different temperatures using layer compositions calculated from EDS data (EDS data provided in ref. [20]): (a) results of equilibrium simulations using the overall layer composition, (b) results of Scheil-equilibrium simulations.

4.3 Ti-6Al-4V to Invar

The Ti-6Al-4V to Invar FGM sample broke into two pieces at the position with around 30-45 vol% Invar during the sectioning process after fabrication. Scheil and equilibrium simulations were carried out for this system with a Fe-Ni-Ti database developed by Keyzer et. al. [42]. High amounts of ordered BCC with about 0.5 Ti site fraction and Laves C14 intermetallic phase were predicted to form in the cracking region by Scheil simulations and were experimentally confirmed. The brittle BCC and intermetallic phases, and CTE mismatch between these phases (9.5 μ m/m-°C for ordered BCC with about 0.5 Ti site fraction [43] and 8 μ m/m-°C for Laves C14 phase [44]) were concluded to be the reason for cracking [27]. Error! Reference source not found. (a) shows the phase fractions in the sample predicted in Scheil simulations. According to the ternary phase diagram shown in Error! Reference source not found. (b), the first BCC peak at ~8 mm distance in Error! Reference source not found. (a) should be mostly disordered BCC phase with high Ti site fraction while the second BCC peak at ~12 mm distance should be mostly ordered BCC phase with high (Fe, Ni) site fraction, which is more brittle than the Ti-rich BCC [39][40].



Figure 13: (a) Scheil-predicted phase fractions using experimentally measured composition (simplified to Fe-Ni-Ti ternary system) along the Ti-6Al-4V to Invar FGM from ref. [27], , where the shaded region represents the span of experimentally observed cracking in the sample. (b) Fe-Ni-Ti ternary isothermal section at 900 °C, with the experimentally obtained EDS compositions indicated by yellow symbols.

Based on both thermodynamic simulations and experiments, a direct path from Ti-6Al-4V to Invar has already been proven to be impossible because of deleterious phase formation resulting in cracking. Crack susceptibility analysis was performed for this gradient path to determine whether solidification cracking also contributed to the cracking (see Figure 14). All the criteria, except for the FR criterion, predicted high susceptibility in the region that cracked, indicating that solidification cracking could have contributed to the failure. High crack susceptibility was also predicted in the Ti-6Al-4V to Invar gradient region near the Ti-6Al-4V composition; however, no crack was observed there since the matrix is mostly HCP phase, which have higher ductility than the Laves C14 phase or the ordered B2 phase. This highlights that neither the deleterious feasibility map nor the crack susceptibility map should be used alone. The deleterious phase map checks feasibility of compositions only in terms of mechanical properties, i.e., higher fractions of TCP phases lead to more brittle behavior that could result in material failure during fabrication. In contrast, crack susceptibility maps only consider the solidification process and ignore the effect of material strength or ductility, i.e., ignoring that some phases can be more tolerant to cracking. When designing gradient pathways, paths with low deleterious phase amounts and low crack susceptibilities are desirable. Paths with high crack susceptibility but within a ductile matrix (for example, FCC phase) and low deleterious phase amount are potentially feasible, but building parameters need to be carefully optimized, as mentioned in section 4.1.



Figure 14: Normalized crack susceptibility criteria calculated using experimentally measured composition along the Ti-6Al-4V to Invar gradient pathway from ref. [27] (simplified to Fe-Ni-Ti ternary system), where the shaded region represents the region where the sample cracked during sectioning.

5. Conclusions

This paper presents a comprehensive method to design gradient pathways for FGMs deposited with DED AM (or generally fusion-based processes) by taking into consideration both deleterious phase formation and the susceptibility of solidification cracking. When applying this method to evaluate four previously studied FGMs, with different terminal alloys, the newly developed feasibility maps were able to predict the compositions where cracking was experimentally observed, enabling a better understanding of the solidification process and a more robust design of FGM gradient pathways than solely considering phase formation. The main conclusions of the present study are:

• Among the five crack susceptibility criteria, the Kou, iCSC and sRDG criteria accurately predicted the compositions of experimentally observed cracking, and these are thus recommended for future FGM pathway designs. Conversely, the FR criterion overestimated the cracking composition range, and as the CSC criterion

underestimated the temperature decrease due to microsegregation and precipitation at the very end of the solidification process, and the predicted cracking region is shifted and sometimes incorrect.

- The present Scheil-equilibrium simulation can predict phase formation at temperatures below solidus temperature considering microsegregation during the solidification process, i.e., considering the interdendritic solid-state phase transformation, which is ignored in Scheil simulations of equilibrium simulations using the overall composition.
- The equilibrium and Scheil simulations successfully captured the formation of intermetallic phases and predicted failure due to their formation. The crack susceptibility criteria successfully predicted solidification cracking due to solidus temperature decrease because of microsegregation and formation of precipitation. The Scheil-equilibrium method was able to predict interdendritic phase formation during the cooling process (e.g. in the SS304L to Ni-20Cr FGM) and thus indicating thermal stress due to CTE mismatch between the phases by the amount of phase forming during the cooling process.
- The agreement between the newly proposed feasibility map and experiments in four different FGM systems supports the assessment of cracking possibility from Scheil and equilibrium simulations of detrimental phases, crack susceptibility criteria for solidification cracking, and Scheil-equilibrium simulations of solid-state phase transformations that supplement the deleterious phase feasibility maps. This proposed aggregate framework provides a pathway toward the design of crack-free FGMs.

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Data availability

All relevant data are available from the authors.

References

- [1] R. M. Mahamood and E. T. Akinlabi, *Introduction to Functionally Graded Materials*.
 2017. doi: 10.1007/978-3-319-53756-6_1.
- [2] V. Boggarapu *et al.*, "State of the art in functionally graded materials," *Compos. Struct.*, vol. 262, no. January, p. 113596, 2021, doi: 10.1016/j.compstruct.2021.113596.
- [3] W. Li and B. Han, "Research and Application of Functionally Gradient Materials," *IOP Conf. Ser. Mater. Sci. Eng.*, vol. 394, no. 2, 2018, doi: 10.1088/1757-899X/394/2/022065.
- S. K. Bohidar, R. Sharma, and P. R. Mishra, "Functionally Graded Materials: A Critical Review," *Int. J. Res.*, vol. 1, no. 7, pp. 289–301, 2014, [Online]. Available: https://journals.pen2print.org/index.php/ijr/article/view/378
- [5] L. D. Bobbio *et al.*, "Design of an additively manufactured functionally graded material of 316 stainless steel and Ti-6Al-4V with Ni-20Cr, Cr, and V intermediate compositions," *Addit. Manuf.*, vol. 51, no. February, p. 102649, 2022, doi: 10.1016/j.addma.2022.102649.
- [6] J. S. Zuback, T. A. Palmer, and T. DebRoy, "Additive manufacturing of functionally

graded transition joints between ferritic and austenitic alloys," *J. Alloys Compd.*, vol. 770, pp. 995–1003, 2019, doi: 10.1016/j.jallcom.2018.08.197.

- [7] B. Chen, Y. Su, Z. Xie, C. Tan, and J. Feng, "Development and characterization of 316L/Inconel625 functionally graded material fabricated by laser direct metal deposition," *Opt. Laser Technol.*, vol. 123, Mar. 2020, doi: 10.1016/j.optlastec.2019.105916.
- [8] F. F. Noecker and J. N. DuPont, "Functionally graded copper steel using laser engineered net shaping TMprocess," *ICALEO 2002 - 21st Int. Congr. Appl. Laser Electro-Optics, Congr. Proc.*, vol. 185430, no. 2002, 2002, doi: 10.2351/1.5066217.
- [9] W. Meng, W. Zhang, W. Zhang, X. Yin, and B. Cui, "Fabrication of steel-Inconel functionally graded materials by laser melting deposition integrating with laser synchronous preheating," *Opt. Laser Technol.*, vol. 131, no. April, p. 106451, 2020, doi: 10.1016/j.optlastec.2020.106451.
- [10] C. Dharmendra, S. Shakerin, G. D. J. Ram, and M. Mohammadi, "Wire-arc additive manufacturing of nickel aluminum bronze/stainless steel hybrid parts – Interfacial characterization, prospects, and problems," *Materialia*, vol. 13, Sep. 2020, doi: 10.1016/j.mtla.2020.100834.
- [11] L. D. Bobbio *et al.*, "Characterization of a functionally graded material of Ti-6Al-4V to 304L stainless steel with an intermediate V section," *J. Alloys Compd.*, vol. 742, pp. 1031–1036, 2018, doi: 10.1016/j.jallcom.2018.01.156.
- B. Onuike and A. Bandyopadhyay, "Additive manufacturing of Inconel 718 –
 Ti6Al4V bimetallic structures," *Addit. Manuf.*, vol. 22, no. June, pp. 844–851, 2018,

doi: 10.1016/j.addma.2018.06.025.

- [13] H. Sahasrabudhe, R. Harrison, C. Carpenter, and A. Bandyopadhyay, "Stainless steel to titanium bimetallic structure using LENSTM," *Addit. Manuf.*, vol. 5, pp. 1–8, 2015, doi: 10.1016/j.addma.2014.10.002.
- T. Kirk, E. Galvan, R. Malak, and R. Arroyave, "Computational design of gradient paths in additively manufactured functionally graded materials," *J. Mech. Des. Trans. ASME*, vol. 140, no. 11, Nov. 2018, doi: 10.1115/1.4040816.
- T. Kirk, R. Malak, and R. Arroyave, "Computational design of compositionally graded alloys for property monotonicity," *J. Mech. Des. Trans. ASME*, vol. 143, no. 3, Mar. 2021, doi: 10.1115/1.4048627.
- [16] M. Allen, T. Kirk, R. Malak, and R. Arroyave, "A Subspace-Inclusive Sampling Method for the Computational Design of Compositionally Graded Alloys."
- [17] B. E. Carroll *et al.*, "Functionally graded material of 304L stainless steel and inconel
 625 fabricated by directed energy deposition: Characterization and thermodynamic modeling," *Acta Mater.*, vol. 108, pp. 46–54, Apr. 2016, doi: 10.1016/j.actamat.2016.02.019.
- T. Li, Z. Wang, S. Hu, Z. Yang, and Y. Wang, "Hot cracking during the fabrication of Inconel 625/stainless steel 308 L functionally graded material by dual-wire arc additive manufacturing," *J. Manuf. Process.*, vol. 82, no. August, pp. 461–473, 2022, doi: 10.1016/j.jmapro.2022.08.018.
- [19] N. Chen *et al.*, "Microstructural characteristics and crack formation in additively manufactured bimetal material of 316L stainless steel and Inconel 625," *Addit. Manuf.*,

vol. 32, no. December 2019, p. 101037, 2020, doi: 10.1016/j.addma.2020.101037.

- [20] L. D. Bobbio, B. Bocklund, Z. K. Liu, and A. M. Beese, "Tensile behavior of stainless steel 304L to Ni-20Cr functionally graded material: Experimental characterization and computational simulations," *Materialia*, vol. 18, Aug. 2021, doi: 10.1016/j.mtla.2021.101151.
- M. H. S. J. L. Robinson, "Liquation Cracking during the Welding of Austenitic Stainless Steels and Nickel Alloys," *Philos. Trans. R. Soc. London. Ser. A*, vol. 295, no. 1413, pp. 105–117, 1980, [Online]. Available: https://www.jstor.org/stable/36462
- [22] V. Kujanpaa, N. Suutala, T. Takalo, and T. Moisio, "Correlation Between Solidification Cracking and Microstructure in Austenitic and Austenitic-Ferritic Stainless Steel Welds.," *Weld. Res. Int.*, vol. 9, no. 2, pp. 55–76, 1979.
- [23] V. Shankar, T. P. S. Gill, S. L. Mannan, and S. Sundarlsan, "Solidification cracking in austenitic stainless steel welds," *Sadhana - Acad. Proc. Eng. Sci.*, vol. 28, no. 3–4, pp. 359–382, 2003, doi: 10.1007/BF02706438.
- [24] H. Yu, J. Liang, Z. Bi, J. Li, and W. Xu, "Computational Design of Novel Ni Superalloys with Low Crack Susceptibility for Additive Manufacturing," *Metall. Mater. Trans. A*, vol. 53, no. 6, pp. 1945–1954, 2022, doi: 10.1007/s11661-022-06653x.
- [25] M. Rappaz, J. M. Drezet, and M. Gremaud, "A new hot-tearing criterion," *Metall. Mater. Trans. A Phys. Metall. Mater. Sci.*, vol. 30, no. 2, pp. 449–455, 1999, doi: 10.1007/s11661-999-0334-z.
- [26] M. A. Easton, M. A. Gibson, S. Zhu, and T. B. Abbott, "An a priori hot-tearing

indicator applied to die-cast magnesium-rare earth alloys," *Metall. Mater. Trans. A Phys. Metall. Mater. Sci.*, vol. 45, no. 8, pp. 3586–3595, 2014, doi: 10.1007/s11661-014-2272-7.

- [27] L. D. Bobbio *et al.*, "Additive manufacturing of a functionally graded material from Ti-6Al-4V to Invar: Experimental characterization and thermodynamic calculations," *Acta Mater.*, vol. 127, pp. 133–142, 2017, doi: 10.1016/j.actamat.2016.12.070.
- [28] L. Kaufman and H. Bernstein, Computer Calculation of Phase Diagrams with Special Reference to Refractory Metals. Academic Press, 1970. [Online]. Available: https://books.google.com/books?id=Sp9TAAAAMAAJ
- [29] E. Scheil, "Bemerkungen zur Schichtkristallbildung," *Int. J. Mater. Res.*, vol. 34, no. 3, pp. 70–72, 1942, doi: doi:10.1515/ijmr-1942-340303.
- [30] G. H. Gulliver, "The quantitative effect of rapid cooling upon the constitution of binary alloys," *J. Inst. Met.*, vol. 9, 1913, [Online]. Available: https://www.scopus.com/inward/record.uri?eid=2-s2.0-0001306571&partnerID=40&md5=516981ce89cfb079f99fe3d3ebbc0556
- [31] B. Bocklund, L. D. Bobbio, R. A. Otis, A. M. Beese, and Z. K. Liu, "Experimental validation of Scheil–Gulliver simulations for gradient path planning in additively manufactured functionally graded materials," *Materialia*, vol. 11, no. April, 2020, doi: 10.1016/j.mtla.2020.100689.
- [32] P. E. A. Turchi, L. Kaufman, and Z. K. Liu, "Modeling of Ni-Cr-Mo based alloys: Part II - Kinetics," *Calphad Comput. Coupling Phase Diagrams Thermochem.*, vol. 31, no.
 2, pp. 237–248, 2007, doi: 10.1016/j.calphad.2006.12.006.

- [33] D. Chung, Z. Ding, and Y. Yang, "Hierarchical Eutectic Structure Enabling Superior Fracture Toughness and Superb Strength in CoCrFeNiNb0 . 5 Eutectic High Entropy Alloy at Room Temperature", doi: 10.1002/adem.201801060.
- [34] S. Yan, D. Wu, F. Niu, G. Ma, and R. Kang, "Al2O3-ZrO2 eutectic ceramic via ultrasonic-assisted laser engineered net shaping," *Ceram. Int.*, vol. 43, no. 17, pp. 15905–15910, 2017, doi: 10.1016/j.ceramint.2017.08.165.
- [35] P. Shi *et al.*, "Hierarchical crack buffering triples ductility in eutectic herringbone high-entropy alloys," *Science (80-.).*, vol. 373, no. 6557, pp. 912–918, 2021, doi: 10.1126/science.abf6986.
- [36] J. O. Andersson, T. Helander, L. Höglund, P. Shi, and B. Sundman, "Thermo-Calc & DICTRA, computational tools for materials science," *Calphad Comput. Coupling Phase Diagrams Thermochem.*, vol. 26, no. 2, pp. 273–312, 2002, doi: 10.1016/S0364-5916(02)00037-8.
- [37] W. Meng *et al.*, "Additive manufacturing of a functionally graded material from Inconel625 to Ti6Al4V by laser synchronous preheating," *J. Mater. Process. Technol.*, vol. 275, no. August 2019, 2020, doi: 10.1016/j.jmatprotec.2019.116368.
- [38] C. Shang, C. Wang, C. Li, G. Yang, G. Xu, and J. You, "Eliminating the crack of laser
 3D printed functionally graded material from TA15 to Inconel718 by base preheating," *Opt. Laser Technol.*, vol. 126, no. November 2019, p. 106100, 2020, doi:
 10.1016/j.optlastec.2020.106100.
- [39] S. A. L., "Constitution Diagram for Stainless Steel Weld Metal," *Met. Prog.*, vol. 56, no. 11, p. 680, 1949, [Online]. Available:

https://cir.nii.ac.jp/crid/1570009751069526400

- [40] D. J. Kotecki and T. a. Siewert, "WRC-1992 Constitution Diagram for Stainless Steel Weld Metals : A Modification of the WRC-1988 Diagram," *AWS Annu. Meet.*, pp. 171–178, 1992, [Online]. Available: http://www.aws.org/wj/supplement/WJ_1992_05_s171.pdf
- [41] G. Lindwall *et al.*, "Simulation of TTT Curves for Additively Manufactured Inconel 625," *Metall. Mater. Trans. A Phys. Metall. Mater. Sci.*, vol. 50, no. 1, pp. 457–467, Jan. 2019, doi: 10.1007/s11661-018-4959-7.
- [42] J. De Keyzer, G. Cacciamani, N. Dupin, and P. Wollants, "Thermodynamic modeling and optimization of the Fe-Ni-Ti system," *Calphad Comput. Coupling Phase Diagrams Thermochem.*, vol. 33, no. 1, pp. 109–123, 2009, doi: 10.1016/j.calphad.2008.10.003.
- [43] N. I. Kourov, V. A. Kazantsev, A. G. Volkov, and T. Sc, "Thermal expansion of ScxTi1 - XFe2 itinerant magnets," *Phys. Solid State*, vol. 41, no. 12, 1999.
- [44] A. Schlieter *et al.*, "Anisotropic mechanical behavior of ultrafine eutectic TiFe cast under non-equilibrium conditions," *Intermetallics*, vol. 19, no. 3, pp. 327–335, 2011, doi: 10.1016/j.intermet.2010.10.012.
- [45] L. F. Zhu *et al.*, "First-principles study of the thermodynamic and elastic properties of eutectic Fe-Ti alloys," *Acta Mater.*, vol. 60, no. 4, pp. 1594–1602, 2012, doi: 10.1016/j.actamat.2011.11.046.