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# Ab Initio Calculation of Surface Thermochemistry for Popular Solid Transition Metal-Based Species

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**ABSTRACT:** This work reports the thermochemistry calculations for solid-phase periodic models of ten popular transition metalbased species. These model structures were refined to stable geometry by geometric optimization along with calculating the thermodynamic properties including enthalpy, entropy, heat capacity at constant pressure, and Gibbs free energy by DMol<sup>3</sup> package via first-principles ab initio calculations. The temperature-dependent thermochemistry values were converted to a NASA sevenpolynomial format. The behavior of different thermodynamic parameters based on temperature was investigated and their comparative analysis was done. A higher number of atoms tends to show higher thermodynamic values. Moreover, these thermodynamic values agree reasonably well with previously reported experimental and computational values. Metal copper shows higher thermodynamic values as compared to its oxide. The thermodynamic properties of lanthanum-based oxides have been newly calculated through the ab initio method. Amorphous structures reveal higher thermodynamic values compared to their crystalline counterparts. A comparison between different transition metal-based species gives a better understanding of the different crystalline structures and their surface sites. These calculated thermodynamic data and polynomials can be used for a variety of thermodynamic calculations and kinetic modeling.

# **1. INTRODUCTION**

The chemical kinetics and mechanisms of chemicals in their different phases have been studied for over a century, and their understanding was the foundation of our modern-day futuristic world. Equilibrium-phase modeling is one of the most important fundamental sciences for the development process in the chemical industry.<sup>1</sup> Thermodynamic data provide a model-based evaluation for the basis of a wide variety of processes including liquid—liquid extraction, solid-based heterogeneous catalysis, and distillation. It also provides a possibility to evaluate data through flow sheet simulations.<sup>2</sup>

Thermochemistry research and its related works were started over 130 years ago. The earliest one was performed by Mallard and Le Chatelier in 1883,<sup>3</sup> and then over the years, researchers have been working on, generating, and searching for the thermodynamic properties of old and new materials to better understand their behavior and kinetics.<sup>4–10</sup> Burcat<sup>11,12</sup> calculated the thermochemistry of materials using GaussianO3 G3/B3LYP (as known as G3B3) calculations. These results

were calculated through geometric optimization using a nonperiodic model.<sup>11</sup> Transition metal-based species are composed of transition metals along with other species; they are abundantly present on earth and are used for a wide variety of applications, including catalytic reactions and photo-assisted adsorption—desorption. They are deeply studied from lab-scale developing research to industrial-scale applications.<sup>13,14</sup>

Previous thermodynamic calculations were mostly limited to gas-phase species with nonperiodic boundary conditions.<sup>15</sup> They were unable to precisely calculate species under their 3d periodic boundary conditions due to the multiple possibilities of order and arrangements that made the calculations more

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complicated. These multiple possibilities influence the species' thermophysical behavior. Some recent developments through quantum methods have been made in the field of material studies, including the usage of machine learning,16,17 Paramendism algorithm,<sup>18</sup> and quasi-harmonic approximations,<sup>19</sup> which are still in the development phase. The present work is an extension toward the understanding of thermodynamic properties for the development of transition metals and their oxides. Understanding the transition metal-based surface and its thermodynamic properties is of immense importance toward the development of the modern chemical industry and environmental protection.<sup>20</sup> The method of simultaneous regression has been used for the approximate conversion of thermochemical properties into a polynomial format, which finally provides NASA's famous seven-term polynomial coefficients.<sup>21,22</sup> Polynomials allow us to simulate thermodynamic properties over a range of temperatures. This gives better insight into the chemical reactions taking place from a small experimental scale to an extraordinary industrial scale. The approach of generating polynomial fits used in the previous works<sup>11</sup> of two temperature ranges was implemented in this work. These calculations enable us to explore the properties of a material beyond its nonperiodic state with a higher number of atoms and layers, which enables us to calculate better and more accurate results compared to its predecessors. Meanwhile, a limitation of the density functional theory (DFT) calculation is that the exact functional of the Hohenberg-Kohn theorem is not known. Every time a DFT calculation is performed, there is an intrinsic uncertainty that exists between the true ground-state energies of the Schrodinger equation and those calculated through the DFT method. Another limitation lies in its computing capability, as a larger and more layered composition of materials might show better results, but these are limited to the modern generation of computational technology. A careful comparison with calorimetry-based experimental results and usage of different functionals can help us overcome the limitations of the current technology and get values closer to the ground-state energy.

The current work aims to apply a DFT-based approach in calculating the thermochemistry of the materials using a much larger number of atoms and layers for solid-phase periodic models. Popular transition metals and their oxides were chosen so that they can be used for different applications. Thermochemistry data were converted to their thermodynamic coefficients in an attempt to make them available for use in different chemical kinetic applications. The calculated data with thermodynamic properties were carefully analyzed and compared with previously calculated and experimental data.

## 2. METHODOLOGY

**2.1. Computational Details.** The thermodynamic properties of ten species were calculated using the DFT method. Most of the species were studied using crystalline models, while for  $La_2O_3^*$ , an amorphous model was used to analyze and compare the behavior of species over a variety of different physical traits and innate qualities. The amorphous model is different from the crystalline model because it lacks the long-range order. Here, a nonperiodic unit cell of lanthanum oxide  $(La_2O_3)$  primitive cubic crystal (point group m3, space group la3 (206)) and lanthanum monoxide (LaO, point group  $Fm\overline{3}$ 'm, space group 225) was taken as a reference; both of them were heated and then quenched using the amorphous cell algorithm along with a rotational isomeric state (RIS)

model<sup>23</sup> to generate an amorphous cell of lanthanum oxide  $(La_2O_3^*)$ . In the amorphous cell construction calculation, a cubic-type lattice was chosen, with a density of  $1.0 \text{ g/cm}^3$  and the output in one frame. Construction calculation was performed at 298 K with 1000 loading steps and the geometry was optimized automatically right after the cell formation at 0.1 cal/mol and 0.5 kcal/mol/Å force. A universal force field-based current was used for the amorphous cell construction and the Ewald-based summation method was used with an accuracy of 0.001 kcalmol<sup>-1</sup>, while van der Waals interactions are atombased. All DFT calculations were performed using the DMol<sup>3</sup> Package.<sup>24,25</sup> The generalized gradient approximation of Perdew-Burke-Ernzerhof (GGA-PBE)<sup>26</sup> and the BLYP (Becke for the exchange part, and Lee, Yang, and Parr for the correlation part)<sup>27,28</sup> functional were selected for exchange and correlation potentials. Due to the difference in size of the crystal and morphology, DMol<sup>3</sup> generates k-points based on equally spaced reciprocal space points depending on the length of the primitive reciprocal space lattice vectors in the first Brillouin zone. The spacing parameter is kept at the default value of 0.03 au, while the k-point separation was kept as 0.08  $Å^{-1}$ ; these k-points are specified in the form of Monkhorst-Pack grid parameters.<sup>29</sup> The orbital cutoffs of La, Cu, Fe, Mn, and Co are 5.0, 4.0, 4.3, 4.4, and 4.1 Å, respectively. Double numerical plus d-function (DND) and double numerical plus polarization (DNP) basis sets were used. Two different basis sets were used on the solid models, which are used for efficient conversion of partial differential functions into algebraic equations. Table S1 (see Supporting Information, SM) shows the species arrangement in ascending order of atoms. For the computation, the pressure was kept constant at 1 bar to simulate real conditions, and the practical usage dictates that 1 bar pressure should be selected to simulate maximum possible stable conditions.<sup>30</sup> The DMol<sup>3</sup> package enables us to calculate the thermodynamics through the results of the hessian evaluation, or vibrational analysis can be used to compute the enthalpy (H), entropy (S), free energy (G), and heat capacity  $(C_p)$  at a constant pressure as a function of temperature; these formulas were devised by Hirano.<sup>31,32</sup> The Helmholtz free energy is a function of temperature for a given structure, which can be determined through the vibrational partition function from the phonon density of states. As a result, using free energy minimization to determine the structure's temperature dependency is a logical technique. Here, the key foundation is the quasi-harmonic approximation, which assumes that the vibrational frequencies can be determined as though the atoms were vibrating purely harmonically while the cell parameters are adjusted to minimize the free energy. Previous studies have indicated that this is a reasonable approximation until a temperature of approximately half the melting point is reached. The smallest LaO unit cell comprises only two atoms, while the largest surface model, La<sub>2</sub>O<sub>3</sub>\*(amorphous), comprises 21% LaO and 79% La<sub>2</sub>O<sub>3</sub>. Table S1 (see SM) shows all of the computational species arranged in an ascending arrangement of the number of atoms. These temperature-dependent thermodynamic properties can be used by converting them into NASA's seven-term polynomial coefficients. Thermodynamic properties can be converted into coefficients through the method of simultaneous regression.<sup>21</sup> These coefficients can be used for kinetic modeling. The crystalline surface and structures have been characterized by various researchers and play a very prominent role in different applications, including heterogenous catalysis,<sup>33-44</sup> as shown in Table S2 (see SM). These peer-reviewed works were used to select the crystalline structure and its exposed surface. The thermodynamic properties of these structures are calculated through DFT. Understanding their thermodynamic behavior and surface catalytic kinetic reactions can help us better understand their role in a variety of applications.

2.2. Thermodynamic Data Generation. The thermodynamic data generated through DFT calculations will be further converted into seven-term thermodynamic coefficients using NASA-designated polynomial equations. These polynomial equations are E1-E6 (see SM). The heat capacity equations are equations E1 and E2, while the enthalpy and entropy equations are E3 and E4, and E5 and E6, respectively. These equations are used to convert the calculated thermodynamic values into NASA seven-term polynomial coefficients using the simultaneous regression developed by Zleznik and Gordon.<sup>21</sup> Polynomial fitting of these six equations will result in the seven-term NASA polynomial coefficients, and these polynomial coefficients are arranged in order so that they can be easily identified by chemical kinetic simulation software. Tables S3 and S4 (see SM) represent the arrangement order for a NASA seven-term polynomial format, which is also used as the input of the thermo input file for CHEMKIN package. The species calculations can be directly used for chemical kinetic calculations. The total temperature range is from 25 to 1000 K, while the mid-temperature is selected as 500 K. The temperature range from 25 to 500 K is considered as the lowtemperature range and from 500 to 1000 K is considered as the high-temperature range. Coefficients a1-a5 of equations E1-E6 are calculated through polynomial fitting. These polynomial fittings were performed using PAST (free statistical software package), and a6 and a7 are calculated using a macro in excel based on simultaneous regression.<sup>21</sup> Table 2 reveals the data converted into the NASA seven-term polynomial format.

## 3. RESULTS AND DISCUSSION

The thermodynamic properties of a material represent the physical state of the system. The calculated models are based

Table 1. Thermodynamic Properties at 298 K

material	enthalpy (H) (kcal/mol)	entropy (S) (cal/(mol·K))	heat capacity (C <sub>p</sub> ) (cal/(mol·K))	free energy (G) (kcal/mol)
LaO(unit)	2.087	5.910	7.011	0.325
CuO(111)	35.629	98.356	84.091	6.305
Cu(111)	31.531	149.560	99.032	-13.060
$Mn_3O_4(unit)$	58.357	175.264	133.919	6.102
$La_2O_3(unit)$	81.507	211.889	198.028	18.333
Fe <sub>2</sub> O <sub>3</sub> (pri)	80.926	222.443	199.432	14.605
Fe <sub>3</sub> O <sub>4</sub> (311)	84.408	220.910	191.759	18.544
Fe <sub>3</sub> O <sub>4</sub> (pri)	116.558	275.404	274.107	34.446
Co <sub>3</sub> O <sub>4</sub> (pri)	190.836	238.459	129.526	72.629
$La_2O_3^*$	105.630	649.732	324.129	-88.088

on the requirements of simulation and chemical kinetics. DFT calculation generates thermodynamic properties. These thermodynamic properties are converted into NASA-based polynomials through simultaneous regression. The properties are calculated within the range of 25–1000 K because most catalytic reactions can take place within this range. The detailed description of the calculated species and their



Figure 1. Entropy and enthalpy of transition metal-based species at 298 K.



**Figure 2.** Heat capacity at constant pressure and free energy of the transition metal-based species at 298 K.



Figure 3. Heat capacity of our calculated species with temperature increment from 25 to 1000 K.

thermodynamic properties are presented in Tables S1 and S2 (see SM). Table 1 displays the thermodynamic properties at

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Figure 4. With  $C_p$  at a constant value, comparison of the calculated species at temperatures of 298.15, 600, 800, and 1000 K.



Figure 5. Free energy of the calculated species with temperature increment from 25 to 1000 K.

298 K (room temperature). Figures 1 and 2 show the graphical representation of H, S,  $C_p$ , and G at 298 K, respectively. H and S values tend to increase as the consecutive number of atoms is increased. The amorphous-type lanthanum-based oxide reveals the highest order of thermodynamic values as compared to its counterparts. The lowest number of atoms of a crystal presents the lowest order of values. The values of Cu(111) are higher than those of CuO(111) and LaO(111), which indicates that metal copper has higher S and  $C_p$  than its oxidized surface. Co and Fe belong to group 8 and 9 of the periodic table, respectively. The oxides of Co and Fe show dissimilar values at 298 K, which exhibit their difference of thermophysical behavior at room temperature. The values in Table 1 reveal that the thermodynamic values of a compound can be influenced by the surface lattice. Tables S5-S14 (see SM) show thermodynamic values concerning the temperature calculated through the first-principles method in detail. The thermodynamic properties of a system at 298 K represent the nature of that species at normal room conditions. These values are essential to understand their behavior for different



Figure 6. Free energy comparison of the calculated species at temperatures of 298.15, 600, 800, and 1000 K.



Figure 7. Enthalpy of the calculated species with temperature increment from 25 to 1000 K.

applications. *G* and  $C_p$  exhibit similar trends in Table 1. In Figure 1, as the number of atoms increases from up to down in increasing order, the calculated *S* values at 298 K consecutively increase except for Fe<sub>3</sub>O<sub>4</sub>(311) and Co<sub>3</sub>O<sub>4</sub>(pri). However, *H* does not show similar trends. In Figure 2, as the structural size increases from left to right,  $C_p$  consecutively increases except for Fe<sub>2</sub>O<sub>3</sub>(pri) and Fe<sub>3</sub>O<sub>4</sub>(311). However, *G* does not show similar trends.

**3.1. Heat Capacity** ( $C_p$ ).  $C_p$  calculated through DFT calculations exhibits a trend of increasing values of thermodynamics as a function of temperature. Most values stabilize at 325 K, which signifies their physical property. The heat required to raise the temperature of a specific species by 1 K is called  $C_p$ . The difference in thermophysical values reflects the behavior associated with different structures and their associated elements. The calculated  $C_p$  values of all of the transition metal-based species are reported in Figures 3 and 4. CuO(111) and Cu(111) display an increasing behavior of thermophysical properties with temperature. At 100 K, Cu(111) and CuO(111) have  $C_p$  values of 73.75 and 42.88



Figure 8. Enthalpy comparison of the calculated species at temperatures of 298.15, 600, 800, and 1000 K.



Figure 9. Entropy of the calculated species with temperature increment from 25 to 1000 K.

cal/(mol·K), respectively. At 500 K,  $C_p$  increases up to 101.76 and 94.25 cal/(mol·K), while at 1000 K, these values surge up to 102.93 and 99.45 cal/(mol·K), respectively. A temperature rise reduces the difference between the  $C_p$  values of these two species. The oxidized copper has lowered  $C_p$  values at temperatures less than 400 °C, but as the temperature increases their values become closer. Lanthanum-based species LaO(unit), La<sub>2</sub>O<sub>3</sub>(unit), and La<sub>2</sub>O<sub>3</sub>\* also have different thermophysical effects. LaO(unit) exhibits a small-increment change. However, it has similar trends. La2O3(unit) and La<sub>2</sub>O<sub>3</sub>\* display similar trends in terms of their heat capacity evolution as a function of temperature. At 100 K, the  $C_p$  values of  $La_2O_3$  (unit) and  $La_2O_3^*$  are 90.50 and 250.04 cal/(mol·K), respectively. At 500 K, Cp increases up to 220.05 and 333.96 cal/(mol·K), while at 1000 K, the values are 230.70 and 338.32  $cal/(mol \cdot K)$ , respectively. Even if the structural arrangement is completely different for both species, the  $C_p$  difference becomes smaller with the increase of temperature. La2O3\* exhibits the highest value of  $C_p$ ; hence, it requires the highest amount of heat per increase in temperature. Iron-based oxides



Figure 10. Entropy comparison of the calculated species at temperatures of 298.15, 600, 800, and 1000 K.

such as  $Fe_2O_3(pri)$ ,  $Fe_3O_4(311)$ , and  $Fe_3O_4(pri)$  exhibit relative trends of  $C_p$ .  $Fe_3O_4(pri)$  and  $Co_3O_4(pri)$  reveal similar thermodynamic trends and similar  $C_p$ .  $La_2O_3(unit)$ ,  $Fe_2O_3(pri)$ , and  $Fe_3O_4(311)$  exhibit stability in values from 325 K.  $Fe_3O_4(311)$  and  $Fe_3O_4(pri)$  present little dissimilarities in their properties due to the difference in the surface lattice.

**3.2. Free Energy.** The calculated G values show a decreasing trend with a consecutive increase in temperature for all species. Smaller structures display small increments of change, while larger structures express higher increments of variation in thermodynamic quantities. The order of G does not express similar trends as C<sub>p</sub>. Concave negative curves are observed for larger structures with more atoms, while smaller structures have small variations in the values of G. The change in G value with temperature for different species displays the change in thermodynamic behavior. Figures 5 and 6 represent the Gibbs energies of the calculated species with increase in temperature.  $La_2O_3^*$  exhibits the most abrupt change to negative values at 150 K, as observed in Table S12 (see SM).  $Co_3O_4(pri)$  shows change to a negative value at 575 K.  $Mn_3O_4(unit)$  and Cu(111) show a negative change in G at around 298.15 K, while others shift at higher temperatures. Figure 6 shows that most species have positive G values at 298.15 K, except for  $La_2O_3^*$ , which has a negative G at 150 K.  $Co_3O_4(pri)$  has negative values at 575 K.  $La_2O_3^*$  displays the most spontaneous change to negative G, while crystalline LaO(unit) is less spontaneous. These spontaneous reactions indicate the feasibility of a reaction to proceed in the forward directions. Most species shift to negative values at 550 K values, which seems to reflect the feasibility of a reaction to occur at higher temperatures. The Gibbs energy for a specific reaction or species is calculated at a specific temperature and pressure; hence, the change of temperature gives the G profile of the species. The negative G is also correlated with increasing entropy. Comparing Figures 6 and 10, It can be observed that a higher H results in lower G. LaO(unit) demonstrates almost zero-G, which indicates the stability of its structure, and no spontaneous change at all temperatures. Co<sub>3</sub>O<sub>4</sub>(pri) shifts to negative G at 500 K.  $La_2O_3^*$  shows the quickest negative G shift. Iron-based oxides  $Fe_2O_3(Pri)$  and  $Fe_3O_4(311)$  exhibit similar values, while  $Fe_3O_4(pri)$  shows a slightly lower value of G.



Figure 11.  $C_p$ , S, H and G comparison for Fe- and La-based species: (a)  $C_p$  and S for Fe-based oxide, (b) G and H for Fe-based oxide, (c)  $C_p$  and S for La-based oxide, (d) G and H for La-based oxide.

**3.3. Enthalpy.** The values of H exhibit a constant rising trend for all samples. The temperature rise of a particular system reflects its kinetic and potential energy rise, which results in increased enthalpy. As can be seen from Figure 7, LaO(unit) does not show a continuous change in H, while larger structures such as Co<sub>3</sub>O<sub>4</sub>(pri) and La<sub>2</sub>O<sub>3</sub>\* portray a much larger change. In Figure 8,  $Co_3O_4(pri)$  shows much larger order of values at 298.15, 600, and 800 K compared with  $La_2O_3^*$ , while the trend is vice versa at 1000 K. The  $C_n$  and H of Co<sub>3</sub>O<sub>4</sub>(pri) show a similar increasing trend; both show changes in peak values at 325 K, as can be seen from Figures 3 and 7. The correlation between G and  $C_p$  indicates that  $Co_3O_4$ shows the highest H value along with a positive Gibbs energy at 500 K, while the stability of  $C_p$  is only reached at 800 K. In Figure 7, Cu(111) and its oxide CuO(111) have similar H values. At temperatures lower than 500 K, they reveal a small difference of H, whereas the oxide leads the metal by a difference of less than 5 kcal/mol. At temperatures higher than 500 K, the difference becomes less than 2 kcal/mol. For lanthanum-based species LaO(unit), La<sub>2</sub>O<sub>3</sub>(unit), and La<sub>2</sub>O<sub>3</sub>\*, at 100 K, the values for  $La_2O_3(unit)$  and  $La_2O_3^*$  are found to be 50.42 and 40.34 kcal/mol, while at 150 K, these values increase up to 56.06 and 59.82 kcal/mol. At 500 K, the values are 123.78 and 171.88 kcal/mol, respectively. LaO reveals similar increasing trends in small increments, while  $La_2O_3(unit)$  and  $La_2O_3^*$  show a larger difference. The enthalpy of La<sub>2</sub>O<sub>3</sub>\* exceeds that of La<sub>2</sub>O<sub>3</sub>(unit) at 150 K,

and it steadily continues to increase. Fe and Co belong to columns 8 and 9 of the periodic table; even though they belong to different columns, their oxides show a similar behavior in properties. The enthalpies of  $Fe_3O_4(pri)$  and  $Co_3O_4(pri)$  reveal similar thermodynamic trends.

3.4. Entropy. The entropy curves display an increasing trend as a function of temperature in a concave manner, as shown in Figure 9. The increase in temperature results in a consecutive decrease in G, which is due to the disorder of the system, as observed in Figure 7. From Figure 5 and Table S1 (see SM), as the number of atoms increases, the enthalpy increases in a similar manner, which is similar to the entropy curves. In Figures 9 and 10, LaO has the lowest values of S, while  $La_2O_3^*$  and  $Fe_3O_4(pri)$  have the highest values.  $La_2O_3^*$ is an amorphous species; the reported properties indicate that amorphous species have the highest disorder. Figures 5 and 6 display that La2O3\* also has the highest negative G, which corresponds to a spontaneous change in its properties. It confirms the general behavior of amorphous materials having the highest entropy and thermodynamic properties.<sup>45</sup> LaO has the lowest disorder, which illustrates its stability.  $La_2O_3(unit)$ and  $La_2O_3^*$  have different S values, which reveals that amorphous materials have more S and negative G with increasing temperature as compared to their crystalline counterparts. From the analysis of Figures 9 and 10, at 100 K, Cu(111) and CuO(111) present entropy values of 30.11 and 53.74 cal/(mol·K). At 500 K, these values become 143.75



Figure 12. Comparison of the entropy (S) and heat capacity ( $C_p$ ) with those from JANAF studies: (a) CuO(111); (b) Cu(111); (c) Fe<sub>2</sub>O<sub>3</sub>(primitive); (d) Fe<sub>3</sub>O<sub>4</sub>(311); (e) Fe<sub>3</sub>O<sub>4</sub>(primitive); and (f) Co<sub>3</sub>O<sub>4</sub>(primitive).



Figure 13. Comparison of the heat capacity ( $C_p$ ) with thermodynamic assessments by CALPHAD with those from other studies: (a)  $Mn_3O_4(pri)$ ; (b)  $La_2O_3(unit)/La_2O_3^*$ ; and (c)  $Co_3O_4(pri)$ .

and 200.55 cal/(mol·K), while at 1000 K, they are 209.87 and 270.21 cal/(mol·K), respectively. It can be noted that Cu(111)

and CuO(111) exhibit similar trends in S values, while values for their oxide species exceed those of the metal at all



Figure 14. Comparison of the thermodynamic values with those of different studies: (a) CuO(111); (b) Cu; and (c) La<sub>2</sub>O<sub>3</sub> (unit) and La<sub>2</sub>O<sub>3</sub>\*.

temperatures. For lanthanum-based species,  $La_2O_3(unit)$  and  $La_2O_3^*$  show different entropies, which reflects the disorders of the materials due to their structural differences. Comparing the values of cobalt and iron for  $Co_3O_4(pri)$  and  $Fe_3O_4(pri)$  from Figures 3, 7, and 9, the performance of entropy is different when compared with H and  $C_p$ . It reflects the disorder of the species' inert property.  $Fe_2O_3(pri)$  and  $Fe_3O_4(311)$  report similar trends and values of *S* at all temperatures.

3.5. Comparison Based on the Surface Lattice and Types of Solids. The correlation among thermodynamic properties, morphological order, and lattice parameters is shown in Figure 11.  $Fe_3O_4(pri)$  is a primitive cell, while  $Fe_3O_4(311)$  is a surface lattice site.  $La_2O_3(unit)$  is crystalline, while  $La_2O_3^*$  is amorphous. The  $C_p$ , S, and H for  $Fe_3O_4(pri)$ are higher as compared to those for  $Fe_3O_4(311)$ . The G of  $Fe_3O_4(pri)$  is higher than that of  $Fe_3O_4(311)$  at 1000 K, and vice versa for values less than 500 K. Both the surface lattice and unit cell show changes in properties as a function of temperature.  $La_2O_3^*$  has higher thermodynamic values as compared to La<sub>2</sub>O<sub>3</sub>(unit), which reveals that it has a higher  $C_{\nu}$ , H, and S but much lower G. These high-end thermodynamic properties indicate the general behavior of an amorphous material, which is well observed here by comparing them with their crystalline counterparts.45

#### 4. COMPARISON WITH OTHER STUDIES

Upon careful comparison with the thermodynamic properties calculated by Chase<sup>30</sup> and thermodynamic assessment calculated through CALPHAD codes,46-48 as displayed in Figures 12 and 13, it can be observed that the  $C_p$  and S values reveal similar trends to the ones reported in the literature.<sup>30</sup> The solid-phase periodic model calculations have comparatively higher thermodynamic values of  $C_p$  and S, when compared with the gas-phase models in JANAF.<sup>30</sup> CALPHAD models are designed to use computational algorithms for the development of phase diagrams. They use experimental results from various resources to effectively calculate accurate phase diagrams.  $^{49,50}$  In Figure 13a,  $Mn_{3}\dot{O}_{4}(pri)$  is compared with  $Mn_3O_4$ (calphad), which shows that the code-generated values are closer to the ones calculated in the current work. For temperatures below  $\sim 600$  °C, it can be observed that  $Mn_3O_4(pri)$  calculated values have an error of less than 5%, while the values tend to show a higher discrepancy at higher temperatures. In Figure 13b,  $La_2O_3(unit)$  and  $La_2O_3^*$  are compared with the values generated through CALPHAD codes. La2O3(calphad) shows a lower order of values as compared to those from the literature. These values can be brought closer by calculating the thermodynamic data of individual species through differential functional groups. In Figure 13c, it can be observed that  $Co_3O_4(pri)$  has similar values at temperatures less than  $\sim 200$  °C and higher than  $\sim$ 900 °C, while there is greater discrepancy in-between these

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Figure 15. Comparison of the thermodynamic values with those of different studies: (a) Mn<sub>3</sub>O<sub>4</sub>(unit) and (b) Fe<sub>2</sub>O<sub>3</sub>(pri).



Figure 16. Comparison of the thermodynamic values with those of different studies: (a)  $Fe_3O_4(311)$  and  $Fe_3O_4(pri)$ ; (b)  $Co_3O_4(pri)$ .

temperatures. These errors could be removed through calculations of these species using different functional groups.

Furthermore, a comparison of the calculated results with the data from literature has been performed. Figure 14 compares

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#### Table 2. Generated NASA Seven-term Polynomial Format Calculated through Ab Initio Calculations

$ \begin{array}{cccc} 2.7163200 \times 10 & 4.96000000 \times 10^{-2} & 1.27650000 \times 10^{-1} & 9.04814000 \times 10^{-8} & -2.4858000 \times 10^{-1} & 3 \\ -4.46439977 \times 10^4 & -1.26768178 \times 10^3 & -4.20852000 3.7210000 \times 10^{-1} & 8.95395000 \times 10^{-4} & 3 \\ -1.13032000 \times 10^{-4} & -5.00026000 \times 10^{-1} & 1.74757122 \times 10.637684233 & 10 \\ -2.655811935 \times 10^3 & -1.46919220 \times 10 & 78153000 \times 10^{-1} & 2.1472830 \times 10^{-1} & -1.4672800 \times 10^{-1} & 2 \\ -3.65811935 \times 10^3 & -1.46919220 \times 10 & 71853000 \times 10^{-1} & 2.92337000 \times 10^{-12} & 3 \\ -3.05811935 \times 10^3 & -1.46919220 \times 10 & 71853000 \times 10^{-1} & 2.92337000 \times 10^{-12} & 3 \\ -3.05681000 \times 10^2 & 2.37964000 \times 10^{-2} & -3.38482000 \times 10^{-1} & 2.4823200 \times 10^{-4} & -6.81928000 \times 10^{-12} & 2 \\ -5.04639313 \times 10^3 & -1.93806300 \times 10^2 & 5.77736381 \times 10 & 10 & 95 & 2.5000 & 1000.00 & 500.000 & 1 \\ 4.60861000 \times 10^2 & -1.93806300 \times 10^2 & -5.7735681 \times 10 & 10.9432249 \times 10 & 4 \\ 7.54915000 \times 10^4 & -5.9593000 \times 10^2 & -2.5593500 & 2.5000 & 1000.00 & 500.000 & 1 \\ 8.34987300 \times 10 & 2.79970000 \times 10^{-1} & -4.17595000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 3 \\ 7.54915000 \times 10^4 & -5.46007782 \times 10^2 & -2.5593500 & 2.5000 & 100^{-1} & 2.20000000 \times 10^{-1} & 3 \\ 7.4915000 \times 10^2 & -5.46007782 \times 10^2 & -2.5593500 \times 2.50^{-2} & 8.85562000 \times 10^{-1} & 3 \\ 2.34505000 \times 10^{-6} & 8.54200000 \times 10^{-1} & -1.98519843 \times 10^2 & 8.87262445 & 4 \\ 1.a_2O_1(unit) & 1.2a_17370 \times 10^3 & 3.16150000 \times 10^{-1} & -5.8822300 \times 10^{-2} & 3.078000 \times 10^{-1} & 3 \\ -2.05289848 \times 10^6 & -5.768601 \times 10^{-2} & -5.88223000 \times 10^{-2} & -1.07807000 \times 10^{-1} & 3 \\ -2.052899400 \times 10^{-6} & -5.36738000 \times 10^{-1} & -3.897262445 & 4 \\ 4.a_2O_1(unit) & 1.2a_173700 \times 10^{-6} & -5.48023000 \times 10^{-4} & 3.90769000 \times 10^{-7} & -1.07807000 \times 10^{-1} & \\ -2.05289948 \times 10^6 & -5.768010 \times 10^{-1} & 1.390769000 \times 10^{-7} & -1.390000000 \times 10^{-1} & \\ -2.05289948 \times 10^6 & -5.768010 \times 10^{-1} & 2.94607100 \times 10^{-7} & -1.390000000 \times 10^{-1} & \\ -1.6372219238 \times 10^6 & -5.768010 \times 10^{-7} & 2.3916000 \times 10^{-7} & -1.390000000 \times 10^{-1} & \\ -1.052322381000 \times 10^{-6}$	CuO(111)	CuO O	1Cu	1	0	<b>0</b> S	25.00	1000.00	500.00	1
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$2.71163200 \times 10 \ 8.49600000 \times 10^{-2} - 1.27650000 \times 10^{-4} \ 9 \ 04814000 \times 10^{-8} - 2.48585000 \times 10^{-11}$							2	
$ \begin{array}{c} 1.13032000 \times 10^{-6} - 5.50025000 \times 10^{-10} 1.47937122 \times 10 6.37684253 \\ 1.a0 & 0 & 1La & 0 & 0 & 2.500 & 1000.00 & 500.00 & 11 \\ 2.68580000 + 70000000 \times 10^{-3} - 7.33684000 \times 10^{-6} 5.2777500 \times 10^{-9} - 1.46728000 \times 10^{-12} & 2.3568100 \times 10^{-2} 2.2937000 \times 10^{-12} & 2.3568100 \times 10^{-2} 2.2937000 \times 10^{-12} & 2.2056400 \times 10^{-2} 2.37964000 \times 10^{-1} 2.41372839 \times 10 - 2.89250634 \\ \hline Cu & 0 & 1Ca & 1 & 0 & 0 & 2.500 & 1000.00 & 500.000 & 11 \\ 4.60861000 \times 10 & 2.1920000 \times 10^{-2} - 1.33612000 \times 10^{-2} 2.4425200 \times 10^{-1} - 3.681928000 \times 10^{-12} & 2.50639313 \times 10^{1} - 13980639 \times 10^{10} - 1.1361000 \times 10 & 7.0300000 \times 10^{-1} - 3.6500000 \times 10^{-1} & 3.59415000 \times 10^{-4} - 5.68936000 \times 10^{-9} - 1.1361000 \times 10 & 7.0300000 \times 10^{-1} - 3.6550000 \times 10^{-1} & 3.3482000 \times 10^{-7} - 8.05520000 \times 10^{-1} & 3.3482000 \times 10^{-7} - 8.05520000 \times 10^{-1} & 3.23405000 \times 10^{-1} - 1.7950000 \times 10^{-1} - 1.7950000 \times 10^{-1} & -1.7950000 \times 10^{-1} & 2.9200000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 3.23405000 \times 10^{-1} & 5.4607782 \times 10^{2} - 2.55035000 9.29650000 \times 10^{-7} - 8.05520000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.200000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.2000000$		$-4.46439977 \times 10^{4} - 1.26768178 \times 10^{2} - 4.20852000 \ 3.37210000 \times 10^{-1} - 8.95395000 \times 10^{-4}$							3	
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$1.13032000 \times 10^{-6} - 5.50026000 \times 10^{-10} 1.47937122 \times 10 6.37684253$								4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	LaO (unit)	LaO O	1La	1	0	0S	25.00	1000.00	500.00	1
$\begin{array}{c c c c c c c c c c c c c c c c c c c $		$2.68580000 \ 4.79000000 \ \times \ 10^{-3} \ - \ 7.33684000 \ \times \ 10^{-6} \ 5.27775000 \ \times \ 10^{-9} \ - \ 1.46728000 \ \times \ 10^{-12}$								2
$ \begin{array}{c} 2.50364000 \times 10^{-7} 2.37964000 \times 10^{-11} - 2.41372839 \times 10 - 2.89250634 \\ Cu(111) & Cu & O & ICu & 1 & 0 & S & 2.500 & 1000.00 & 500.000 & 11 \\ 4.60861000 \times 10 & 2.19200000 \times 10^{-2} - 3.38482000 \times 10^{-5} 2.44625000 \times 10^{-1} - 3.65000000 \times 10^{-1} & 2.5401000 \times 10^{-1} - 4.1505000 \times 10^{-1} - 2.5000 & 1000.00 & 500.000 & 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.2000000 \times 10^{-1} & 2.20000000 \times 10^{-1} & 2.2345050000 \times 10^{-1} & - 5.46607782 \times 10^{2} & - 5.286023000 \times 10^{-1} & - 2.20000000 \times 10^{-3} & 3.2345050000 \times 10^{-1} & - 5.46607782 \times 10^{2} & - 5.286023000 \times 10^{-1} & - 2.2000000 \times 10^{-3} & 3.234505000 \times 10^{-1} & - 5.88022900 \times 10 & 2.050900 & 0.634000000 \times 10^{-1} & 2.02898948 \times 10^{5} & - 8.78483692 \times 10^{5} & - 8.88022900 \times 10 & 2.0599000 & - 6.34000000 \times 10^{-3} & 3.935664000 \times 10^{-1} & - 5.36738000 \times 10^{-1} & 2.66671000 \times 10^{-1} & - 1.39200000 \times 10^{-3} & 3.88202900 \times 10^{-1} & 1.89925000 \times 10^{-1} & - 1.39200000 \times 10^{-3} & 3.892094000 \times 10^{-4} & 1.29839000 \times 10^{-1} & 2.66671000 \times 10^{-7} & 5.23460000 \times 10^{-1} & 3.892094000 \times 10^{-4} & 1.29839000 \times 10^{-1} & 1.89925000 \times 10^{-7} & - 2.3460000 \times 10^{-1} & 3.892094000 \times 10^{-4} & 1.29839000 \times 10^{-1} & - 1.39200000 \times 10^{-3} & 3.829094000 \times 10^{-4} & 1.29839000 \times 10^{-1} & 2.16633900 \times 10^{-7} & - 6.3635000 \times 10^{-1} & 1.9900000 \times 10^{-3} & 3.829094000 \times 10^{-4} & 1.29839000 \times 10^{-1} & - 1.3400000 \times 10^{-1} & 3.38464290 \times 10 & 7.29867000 \times 10^{-1} & - 1.34000000 \times 10^{-3} & 3.20867000 \times 10^{-1} & - 1.34000000 \times 10^{-3} & 3.20867000 \times 10^{-1} & - 1.34000000 \times 10^{-3} & 3.20867000 \times 10^{-1} & - 1.34000000 \times 10^{-3} & 3.20867000 \times 10^{-1} & - 1.34000000 \times 10^{-3} & 3.20867000 \times 10^$		$-3.65811935 \times 10^{3} - 1.46919220 \times 10\ 7.81530000 \times 10^{-1}\ 1.71100000 \times 10^{-2} - 2.92337000 \times 10^{-12}$								3
$ \begin{array}{c} {\rm Cu} (111) \\ {\rm Cu} & {\rm O} & {\rm ICu} & {\rm I} & {\rm 0} & {\rm 0S} & {\rm 2.5000} & {\rm 1000.00} & {\rm 500.000} & {\rm 1} \\ {\rm 4.60861000 \times 10 \ 2.19200000 \times 10^{-2} \ -3.38482000 \times 10^{-3} \ 2.44625000 \times 10^{-8} \ -6.81928000 \times 10^{-3} & {\rm 2} \\ {\rm -5.04639313 \times 10^{4} \ -1.93806309 \times 10^{6} \ -1.13161000 \times 10 \ 7.000000 \times 10^{-7} \ -6.85600000 \times 10^{-3} & {\rm 3} \\ {\rm 7.54915000 \times 10^{-6} \ -5.68936000 \times 10^{-1} \ -6.57733681 \times 10 \ 1.94322469 \times 10 & {\rm 10} \\ {\rm 8.34087300 \times 10 \ 2.79970000 \times 10^{-1} \ -1.417595000 \times 10^{-7} \ -8.05562000 \times 10^{-11} & {\rm 2} \\ {\rm -1.41606458 \times 10^{5} \ -5.46607782 \times 10^{2} \ -2.55035000 \ 9.29650000 \times 10^{-1} \ -2.20000000 \times 10^{-3} & {\rm 3} \\ {\rm 2.34505000 \times 10^{-6} \ -5.846007782 \times 10^{2} \ -2.55035000 \ 9.29650000 \times 10^{-7} \ -2.0000000 \times 10^{-3} & {\rm 3} \\ {\rm 2.34505000 \times 10^{-6} \ -5.84600700 \times 10^{-1} \ -5.48023000 \times 10^{-4} \ 3.90769000 \times 10^{-7} \ -1.07807000 \times 10^{-1} & {\rm 3} \\ {\rm 2.02289848 \times 10^{5} \ -8.78433692 \times 10^{2} \ -5.88202900 \times 10 \ 2.0539000 \ -6.34000000 \times 10^{-3} & {\rm 3} \\ {\rm 3.3664000 \times 10^{-6} \ -5.36738000 \times 10^{-9} \ 8.81279130 \times 10^{2} \ 1.40210125 \times 10^{2} & {\rm 6.34000000 \times 10^{-1} \\ {\rm -0.052929848 \times 10^{5} \ -3.27680010 \times 10^{-7} \ -2.86671000 \times 10^{-1} \ -3.8900000 \times 10^{-7} \ -5.243600000 \times 10^{-1} & {\rm 3} \\ {\rm 7.6} & {\rm 0} & {\rm 16^{2} \ -1.77548000 \times 10^{-6} \ 8.81279130 \times 10^{2} \ 1.40210125 \times 10^{2} & {\rm 10^{-1} \ -1.53900000 \times 10^{-1} \ -2.19693862 \times 10^{2} \ -2.0829900 \times 10^{-7} \ -5.24360000 \times 10^{-1} & {\rm 3} \\ {\rm 8.59016600 \times 10 \ -1.2889000 \times 10^{-7} \ -3.81818000 \times 10^{-7} \ -6.03555000 \times 10^{-1} \ -1.91000000 \times 10^{-3} & {\rm 3} \\ {\rm 8.59016600 \times 10 \ -2.77811118 \times 10^{5} \ -1.16633900 \times 10^{-7} \ -6.03555000 \times 10^{-1} \ -1.91000000 \times 10^{-3} & {\rm 3} \\ {\rm 2.0329000 \times 10^{-6} \ -2.78811188 \times 10^{5} \ -1.418922000 \times 10^{-7} \ -8.32266000 \times 10^{-1} \ -1.8900000 \times 10^{-3} & {\rm 3} \\ {\rm 2.0329000 \times 10^{-6} \ -3.35846499 \times 10^{-5} \ -3.88464990 \times 10^{-5} \ -3.88464990 \times 10^{-5} \ -3.88464990 \times 10^{-5} \ -3.88464990 \times 10^{-7} \ -8.32266000 \times 10^{-1$		$2.50364000 \times 10^{-9} 2.37964000 \times 10^{-11} - 2.41372839 \times 10 - 2.89250634$								
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Cu(111)	Cu O	1Cu	1	0	0S	25.000	1000.00	500.000	1
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		4.60861000 × 10 2.192	$100000 \times 10^{-2}$ -	- 3.38482000	$0 \times 10^{-5} 2.4$	$4625000 \times 1$	$10^{-8} - 6.819280$	$00 \times 10^{-12}$		2
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$-5.04639313 \times 10^{4} - 1.93806309 \times 10^{2} - 1.13161000 \times 10\ 7.70030000 \times 10^{-1} - 3.65000000 \times 10^{-3}$							3	
$ \begin{array}{llllllllllllllllllllllllllllllllllll$		$7.54915000 \times 10^{-6} - 10^{-6}$	$5.68936000 \times 10^{-10}$	0 <sup>-9</sup> 6.577336	81 × 10 1.9	4322469 × 1	0			4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Mn3O4 (pri)	Mn <sub>3</sub> O <sub>4</sub> O	1Mn	1	0	0S	25.000	1000.00	500.000	1
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		8.34087300 × 10 2.799	$70000 \times 10^{-1}$ -	- 4.17595000	$10^{-4} 2.9$	4420000 × 1	$10^{-7} - 8.055620$	$100 \times 10^{-11}$		2
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$-1.41606458 \times 10^{5}$ -	$5.46607782 \times 1$	$0^2 - 2.55035$	5000 9.2965	$0000 \times 10^{-1}$	- 2.2000000	$\times 10^{-3}$		3
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$2.34505000 \times 10^{-6} - 10^{-6}$	$8.54200000 \times 10^{-10}$	$0^{-10} - 1.985$	$19843 \times 10$	$^{2} - 8.972624$	45			4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	$La_2O_3(unit)$	La <sub>2</sub> O <sub>3</sub> O	1La	1	0	0S	25.000	1000.00	500.000	1
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$1.34171370 \times 10^2 3.61$	$580000 \times 10^{-1}$	- 5.4802300	$0 \times 10^{-4}$ 3.	90769000 $\times$	$10^{-7} - 1.07807$	$000 \times 10^{-10}$		2
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$-2.08298948 \times 10^{5} - 8.78483692 \times 10^{2} - 5.88202900 \times 10 \ 2.06399000 - 6.34000000 \times 10^{-3}$								3
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$9.33664000 \times 10^{-6} - 5.36738000 \times 10^{-9} 8.81279130 \times 10^2 1.40210125 \times 10^2$								4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Fe <sub>2</sub> O <sub>3</sub> (pri)	Fe <sub>2</sub> O <sub>3</sub> O	1Fe	1	0	0S	25.000	1000.00	500.000	1
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		6.95143600 × 10 1.752	$100000 \times 10^{-1}$ -	- 2.66071000	$0 \times 10^{-4} 1.8$	89925000 × 1	$0^{-7} - 5.243600$	$00 \times 10^{-11}$		2
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$-1.05329238 \times 10^{5} - 3.27686001 \times 10^{2} - 1.71754800 \times 10\ 7.68630000 \times 10^{-1} - 1.39000000 \times 10^{-3}$								3
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$8.29094000 \times 10^{-8}$ 1.2	$9839000 \times 10^{-9}$	2.19693862	$\times 10^2 4.28$	$022436 \times 10$				4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Fe <sub>3</sub> O <sub>4</sub> (311)	Fe <sub>3</sub> O <sub>4</sub> O	1Fe	1	0	0S	25.000	1000.00	500.000	1
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$5.90216600 \times 10 \ 2.08510000 \times 10^{-1} - 3.11881000 \times 10^{-4} \ 2.20316000 \times 10^{-7} - 6.03635000 \times 10^{-11}$								2
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		$-1.02203167 \times 10^{5} - 2.76811189 \times 10^{2} - 1.18633900 \times 10 \ 7.62510000 \times 10^{-1} - 1.91000000 \times 10^{-3}$								3
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$2.20329000 \times 10^{-6} - 9$	$.22281000 \times 10^{-10}$	<sup>-10</sup> 9.334645	$29 \times 10 \ 2.1$	5444459 × 1	.0			4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Fe <sub>3</sub> O <sub>4</sub> (pri)	Fe <sub>3</sub> O <sub>4</sub> O	1Fe	1	0	0S	25.000	1000.00	500.000	1
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		8.88471000 × 10 2.773	$10000 \times 10^{-1}$ -	- 4.19455000	$10^{-4} 2.9$	$8687000 \times 1$	$0^{-7} - 8.232660$	$100 \times 10^{-11}$		2
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$-1.45722196 \times 10^{5} - 4.35883015 \times 10^{2} - 2.49267100 \times 10 \ 9.82720000 \times 10^{-1} - 1.34000000 \times 10^{-3}$								3
$ \begin{array}{cccc} Co_3O_4(pri) & Co_3O_4 & O & Co & 1 & 0 & 0S & 25.000 & 1000.00 & 500.000 & 1 \\ & 8.88471000 \times 10 & 2.77310000 \times 10^{-1} & -4.19455000 \times 10^{-4} & 2.98687000 \times 10^{-7} & 8.23266000 \times 10^{-11} & 2 \\ & -1.45720018 \times 10^5 & -4.87618798 \times 10^2 & -2.49267100 \times 10 & 9.82720000 \times 10^{-1} & -1.34000000 \times 10^{-3} & 3 \\ & -1.22506000 \times 10^{-6} & 2.83521000 \times 10^{-9} & 3.70781044 \times 10^2 & 5.61235374 \times 10 & 4 \\ La_2O_3^* & La_2O_3 & O & 1La & 1 & 0 & 0S & 25.000 & 1000.00 & 500.000 & 1 \\ & 2.96764660 \times 10^2 & 1.58440000 \times 10^{-1} & -2.43599000 \times 10^{-4} & 1.75509000 \times 10^{-7} & -4.88041000 \times 10^{-11} & 2 \\ & -3.28730654 \times 10^5 & -1.60389747 \times 10^3 & 3.69975400 \times 10 & 3.31829000 & -1.48200000 \times 10^{-2} & 3 \\ & 2.96812000 \times 10^{-5} & -2.19225000 \times 10^{-8} & -1.87139521 \times 10^3 & -8.97262445 & 4 \end{array} $		$-1.22506000 \times 10^{-6} 2.83521000 \times 10^{-9} 3.58464990 \times 10^{2} 5.64159380 \times 10^{2}$								4
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Co <sub>3</sub> O <sub>4</sub> (pri)	Co <sub>3</sub> O <sub>4</sub> O	Co	1	0	0S	25.000	1000.00	500.000	1
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$8.88471000 \times 10 \ 2.77310000 \times 10^{-1} - 4.19455000 \times 10^{-4} \ 2.98687000 \times 10^{-7} - 8.23266000 \times 10^{-11}$							2	
$ \begin{array}{c c c c c c c c c c c c c c c c c c c $		$-1.45720018 \times 10^{5} - 4.87618798 \times 10^{2} - 2.49267100 \times 10 \ 9.82720000 \times 10^{-1} - 1.34000000 \times 10^{-3}$							3	
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		$-1.22506000 \times 10^{-6} 2.83521000 \times 10^{-9} 3.70781044 \times 10^{2} 5.61235374 \times 10^{2}$							4	
$\begin{array}{l} 2.96764660 \times 10^2 \ 1.58440000 \times 10^{-1} - 2.43599000 \times 10^{-4} \ 1.75509000 \times 10^{-7} - 4.88041000 \times 10^{-11} \\ -3.28730654 \times 10^5 - 1.60389747 \times 10^3 \ 3.69975400 \times 10 \ 3.31829000 - 1.48200000 \times 10^{-2} \\ 3.96812000 \times 10^{-5} - 2.19225000 \times 10^{-8} - 1.87139521 \times 10^3 - 8.97262445 \end{array}$	$La_2O_3^*$	La <sub>2</sub> O <sub>3</sub> O	1La	1	0	0S	25.000	1000.00	500.000	1
$-3.28730654 \times 10^{5} - 1.60389747 \times 10^{3} \ 3.69975400 \times 10 \ 3.31829000 - 1.48200000 \times 10^{-2} $ 3 2.96812000 × 10 <sup>-5</sup> - 2.19225000 × 10 <sup>-8</sup> - 1.87139521 × 10 <sup>3</sup> - 8.97262445 4		$2.96764660 \times 10^2 1.58$	$440000 \times 10^{-1}$	- 2.4359900	$0 \times 10^{-4}$ 1.	$75509000 \times$	$10^{-7} - 4.88041$	$000 \times 10^{-11}$		2
$2.96812000 \times 10^{-5} - 2.19225000 \times 10^{-8} - 1.87139521 \times 10^{3} - 8.97262445 $		$-3.28730654 \times 10^{5}$ -	$1.60389747 \times 1$	0 <sup>3</sup> 3.6997540	00 × 10 3.3	1829000 - 1	$.48200000 \times 10$	-2		3
		$2.96812000 \times 10^{-5} - 10^{-5}$	$2.19225000 \times 10^{-10}$	$0^{-8} - 1.8713$	$9521 \times 10^{3}$	- 8.972624	45			4

the thermodynamic properties of CuO(111), Cu(111), and  $La_2O_3(unit)/La_2O_3^*$  with the data reported by JANAF<sup>51</sup> and Wu.<sup>52</sup> The calculated values exhibit similar trends to the literature ones.  $C_p$  and S show a difference of  $\pm 100 \text{ cal/(mol·}$ K), while H and G show a difference of  $\pm 200$  kcal/mol, as shown in Figure 14a. The calculated  $C_p$  and S values and reported data indicate a difference of  $\pm 100$  cal/(mol·K), while *H* and *G* show a difference of  $\pm 50$  kcal/mol (Figure 14b). The calculated data show a difference of  $\pm 200 \text{ cal/(mol·K)}$  for  $La_2O_3$  and  $\pm 600$  cal/(mol·K) for  $La_2O_3^*$  for  $C_p$  and S, respectively, whereas H and G show slightly larger differences. Comparison with experimental data has been done through analysis of the work done by Knacke,<sup>53</sup> Decterov,<sup>54</sup> and Berman.<sup>55</sup> Figure 15 compares the thermodynamic properties of  $Mn_3O_4(unit)$  and  $Fe_2O_3(pri)$  with those from Knacke<sup>53</sup> and Decterov.<sup>54</sup> Mn<sub>3</sub>O<sub>4</sub>(111) shows a difference of  $\pm 150$  cal/(mol· K) for  $C_p$  and S, but larger differences for H and G. Fe<sub>2</sub>O<sub>3</sub>(pri) tends to show  $\pm 200 \text{ cal/(mol·K)}$  difference for both  $C_p$  and S, while there is a difference of  $\pm 2000$  kcal/mol for both H and G. Figure 16 compares the thermodynamic properties of  $Fe_3O_4$ 

(311)/Fe<sub>3</sub>O<sub>4</sub>(pri) and Co<sub>3</sub>O<sub>4</sub>(pri) with the values from Berman<sup>55</sup> and JANAF.<sup>51</sup> In Figure 16a,b, Fe<sub>3</sub>O<sub>4</sub>(unit), Fe<sub>2</sub>O<sub>3</sub>(unit), and Co<sub>3</sub>O<sub>4</sub> show similar trends to JANAF. The calculated values show a difference of about  $\pm 200$  cal/(mol·K) for C<sub>p</sub> and S, while H and G have differences of  $\pm 3000$  kcal/ mol. The comparison shows similar trends for the calculated thermodynamic properties but the values differ positively or negatively. These changes in properties are due to the current limitations of computational resources. These variations can greatly affect the calculations. Further calculations using different functional groups can help to find the model and properties closer to experimental data.

## 5. NASA SEVEN-TERM POLYNOMIAL FORMAT

The thermodynamic values generated through DFT calculations are converted into a NASA seven-term polynomial format through simultaneous regression by using equations E1-E6 (see SM). These values were calculated using a similar strategy as in the literature.<sup>11,12</sup> Table 2 represents the thermodynamic coefficients calculated through ab initio

calculations. These thermodynamic coefficients can be used for understanding the chemical kinetics in heterogeneous models and can give insights into the simulation and experimental behavior of popular material species.

# 6. CONCLUSIONS

Thermochemistry calculations were performed based on ground-state energy calculations and thermal corrections at different temperatures. Analysis of these thermodynamic properties points out the behavior of these materials based on their S, H,  $C_{p}$ , and G. A higher number of atoms tends to own larger thermodynamic values. The S and H of most species express similar trends with increasing temperature. Amorphous La2O3\* exhibits higher thermodynamic values as compared to its crystalline form. LaO(unit) and Co<sub>3</sub>O<sub>4</sub>(pri) have positive G at higher temperatures, while  $La_2O_3^*$  and Cu(111) have negative G at 298 K. The negative G at low temperatures represents the abrupt reactive behavior of these materials. Thermodynamic values vary based on different lattice parameters and arrangement of atoms. The calculated values present similar trends to the values reported in the literature. The calculated thermodynamic parameters and thermodynamic coefficients for transition metal-based species offer the opportunity for a better understanding of metal oxides and their thermodynamics. These surface thermodynamic coefficients can be used for different thermodynamic calculations. The quality of the thermodynamic values can be improved by calculating over larger surfaces and using the appropriate correlation functions. Moreover, the strategy developed in the present work could be further applied to obtain the surface thermochemistry of other materials.

## ASSOCIATED CONTENT

#### **5** Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acsomega.1c02178.

Details of the used equations from E1 to E6; parameter tables for surface species along with its calculation and arrangement of generated polynomial coefficient from Tables S1 to S4; tables of the generated thermodynamic data for all calculated species from Tables S5 to S13 (PDF)

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# Notes

The authors declare no competing financial interest.

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