



Article Lattice Thermal Conductivity of Mg₃(Bi,Sb)₂ Nanocomposites: A First-Principles Study

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Abstract: Mg₃(Bi_xSb_{1-x})₂ ($0 \le x \le 1$) nanocomposites are a highly appealing class of thermoelectric materials that hold great potential for solid-state cooling applications. Tuning of the lattice thermal conductivity is crucial for improving the thermoelectric properties of these materials. Hereby, we investigated the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ nanocomposites with varying Bi content (x = 0.0, 0.25, 0.5, 0.75, and 1.0) using first-principles calculations. This study reveals that the lattice thermal conductivity follows a classical inverse temperature-dependent relationship. There is a significant decrease in the lattice thermal conductivity when the Bi content increases from 0 to 0.25 or decreases from 1.0 to 0.75 at 300 K. In contrast, when the Bi content increases from 0.25 to 0.75, the lattice thermal conductivity experiences a gradual decrease and reaches a plateau. For the nanohybrids (x = 0.25, 0.5, and 0.75), the distribution patterns of the phonon group velocity and phonon lifetime are similar, with consistent distribution intervals. Consequently, the change in lattice thermal conductivity is not pronounced. However, the phonon group speed and phonon lifetime are generally lower compared to those of the pristine components with x = 0 and x = 1.0. Our results suggest that the lattice thermal conductivity is sensitive to impurities but not to concentrations. This research provides valuable theoretical insights for adjusting the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ nanocomposites.

Keywords: $Mg_3(Bi_xSb_{1-x})_2$; lattice thermal conductivity; first-principles calculations

1. Introduction

Thermoelectric (TE) materials can convert thermal energy into electricity, making them a potential solution to the current energy crisis [1–9]. Among these materials, Mg₃(Bi_xSb_{1-x})₂ is the most promising candidate for TE applications near room temperature (RT) due to its lower cost than the commercially available Bi₂Te_{3-x}Se_x [10–12]. As a result, it has received considerable attention [13–26]. Researchers are constantly working to improve the thermoelectric performance of these materials. The thermoelectric figure of merit, ZT, is typically used to evaluate performance, which is defined as $zT = S^2\sigma T/(\kappa_l + \kappa_e)$. The parameters T, S, σ , κ_l , and κ_e represent the Kelvin temperature, Seebeck coefficient, electrical conductivity, lattice thermal conductivity, and electronic thermal conductivity, respectively [27]. Achieving a high thermoelectric figure of merit requires a high Seebeck coefficient (S), high electrical conductivity (σ), and low thermal conductivity (κ) [28]. Yet, achieving this is challenging due to the complicated interplay among these parameters. It is believed that reducing the lattice thermal conductivity is crucial for achieving high TE performance.

There are currently many methods available to reduce the thermal conductivity of thermoelectric materials. Biswas et al. achieved the maximum reduction in the lattice



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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). thermal conductivity of PbTe thermoelectric materials via considering scattering sources on all relevant length scales in a hierarchical manner, ranging from atomic-scale lattice disorder and nanoscale endotaxial precipitates to mesoscale grain boundaries [29]. Nakamura et al. overcame the amorphous limit of thermal conductivity in Si thermoelectric materials through constructing a Si nanostructure with "well-controlled nanoscale-shaped interfaces" and oriented nanocrystals (NCs), resulting in a significant reduction in thermal conductivity [30]. Zhang et al. achieved a reduction in thermal conductivity and improved thermoelectric performance through doping Sb in Mg₂(Si,Sn) compounds [31]. Mo et al. demonstrated that doping a small amount of Se into Mg₃Bi_{1.4}Sb_{0.6} can effectively reduce the thermal conductivity of the system [32]. Knura et al. found that alloying PbTe with SnTe leads to a significant reduction in lattice thermal conductivity to values below approximately 1.0 W m⁻¹ K⁻¹ across a wide range of compositions (from x = 0.25 to x = 0.80) [33]. Here, we focus on the effect of alloying Mg₃Bi₂ with Mg₃Sb₂ on the lattice thermal conductivity of the Mg₃(Sb,Bi)₂ system.

The lattice thermal conductivity of Mg_3X_2 (X = Bi, Sb) has been thoroughly researched. Mg_3X_2 (X = Bi and Sb) has an uncommonly low lattice thermal conductivity that can be attributed to the notable softening and flattening of low-energy transverse acoustic phonons [15,34,35]. Zhang et al. offered new insights into the low lattice thermal conductivity of Mg_3Bi_2 through relating the pronounced phonon anharmonicity to the asymmetric nature of Bismuth's 6s lone-pair electrons [15]. Contrary to the anticipated T⁻¹ temperaturedependent κ_l at high temperatures, Zhu et al. discovered that Mg_3Sb_2 exhibits a feeble temperature dependence of κ_l following a power law of T^{-0.48} from theory and T^{-0.57} from experimental measurements. This weak dependence can be traced back to the stiffening of low-lying phonons and diminished anharmonicity at high temperatures, as indicated by the authors [36]. Mg_3Sb_2 and Mg_3Bi_2 can be combined in different stoichiometric ratios [37–40]. The combination of these compounds has been found to lower lattice thermal conductivity [41]. Nonetheless, it is still a major challenge to synthesize ternary $Mg_3(Bi,Sb)_2$ with a controllable Bi/Sb ratio [42].

Computational simulations are crucial for studying the thermal properties of $Mg_3(Bi,Sb)_2$. Various first-principles-based software, including phono3py [43] and ShengBTE [44], have been used to explore phonon transport phenomena. The lattice thermal conductivity of Mg₃(Bi,Sb)₂ has been studied to a limited extent using first-principles calculations, unlike that of Mg_3X_2 (X = Bi, Sb), due to its computational cost. Additionally, machine learning potentials have emerged as an alternative approach to expedite research on heat transport [45–48]. hiPhive, developed by Eriksson et al., efficiently extracts high-order force constants from density functional theory calculations [49,50]. Yang et al. utilized a machine learning potential function based on dual adaptive sampling to investigate the lattice thermal conductivity of Mg₃Sb₂, and obtained results consistent with the experimental data [51]. Ouyang and colleagues conducted a molecular dynamics (MD) exploration of the thermal properties of $Mg_3(Bi_xSb_{1-x})_2$ using a moment tensor potential (MTP) model [52,53]. They developed an MTP model, which was based on machine learning (ML). Their predictions of changes in thermal conductivity with varying solution concentrations were generated using molecular dynamics simulations based on ML-interatomic potential (MLIAP) [54].

In this research, we analyze the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$) utilizing first-principles calculations. Initially, we assess the crystal structure, thermodynamic stability, and dynamic stability of $Mg_3(Bi_xSb_{1-x})_2$ at different Bi contents (x = 0.0, 0.25, 0.5, 0.75, and 1.0). Subsequently, we examine the heat capacity, phonon group velocity, and phonon lifetime of $Mg_3(Bi_xSb_{1-x})_2$ to identify the factors that affect the changes in lattice thermal conductivity in the presence of various Bi contents.

2. Methods

The unit cell structure of Mg₃Bi₂ and Mg₃Sb₂ comprises five atoms. To investigate alternative structures, we expanded the Mg₃Bi₂ unit cell to create a $1 \times 1 \times 2$ supercell.

In this supercell, Sb atoms substitute Bi atoms, yielding three nanohybrid structures: Mg₃Bi_{1.5}Sb_{0.5}, Mg₃BiSb, and Mg₃Bi_{0.5}Sb_{1.5}. We used first-principles calculations with VASP [55,56] to determine the lowest-energy structures for each composition. To compute the phonon spectrum, we utilized Phonopy [57–59] via the finite-displacement supercell approach. In the finite-displacement supercell approach, the first-principles calculation is utilized to acquire atomic forces in the supercell crystal structure model. Force constants were computed from an adequate number of supercells with distinct sets of displacements and corresponding forces were obtained using the first-principles calculation. For Mg₃Bi₂ and Mg₃Sb₂, $3 \times 3 \times 2$ supercells were utilized, while $3 \times 3 \times 1$ supercells were employed for Mg₃Bi_{1.5}Sb_{0.5}, Mg₃BiSb, and Mg₃Bi_{0.5}Sb_{1.5}.

The thermal conductivity κ_l is closely related to heat capacity, phonon group velocity, and phonon lifetime, as shown in Equation (1):

$$\kappa_l = \frac{1}{NV_0} \sum_{\lambda} C_{\lambda} v_{\lambda}^2 \tau_{\lambda} \tag{1}$$

where λ represents the phonon mode, N is the total number of q points used to sample the Brillouin zone, V_0 stands for the volume of a unit cell, and C_{λ} , v_{λ} , and τ_{λ} indicate the specific heat capacity, group velocity, and phonon lifetime, respectively. The C_{λ} values were determined via analyzing the phonon density of states using the Bose-Einstein distribution. On the other hand, the v_{λ} values were obtained via calculating the gradient of the phonon dispersion relation. To account for various phonon scattering mechanisms, the phonon relaxation time τ_{λ} can be divided into three contributions: phonon–phonon scattering, phonon–grain boundary scattering, and phonon–defect scattering. This division is performed using Matthiessen's rule [60]. In the current study, our main focus is on phonon–phonon scattering. We calculated the phonon relaxation time for this type of scattering using the harmonic and third-order anharmonic force constants obtained from density functional theory (DFT) calculations. To solve the phonon Boltzmann transport equation (BTE) [61] and calculate the lattice thermal conductivity, we employed the phono3py framework within the DFT framework. Phono3py is a tool that allows us to compute properties related to phonon–phonon interactions. At each step, the users invoked phono3py with at least the unit cell and the supercell matrix. In the first step, we generated supercells and sets of atomic displacements. These sets of displacements are referred to as "displacement datasets". We constructed supercells using these displacements. Next, we calculated the forces of the supercell models using the VASP software, which we refer to as "force sets". In the second step, we computed the second- and third-order force constants (fc2 and fc3) from the displacement datasets and force sets obtained in the first step. Finally, in the third step, we utilized the force constants obtained in the second step to calculate various properties, such as the lattice thermal conductivity, specific heat capacity, phonon group velocity, phonon lifetime, and mode-Grüneisen parameters. Due to the computationally intensive nature of lattice thermal conductivity calculations, particularly for larger unit cells, we used relatively smaller supercells in our computations. We utilized a $2 \times 2 \times 1$ supercell for Mg₃Bi_{1.5}Sb_{0.5}, Mg₃BiSb, and Mg₃Bi_{0.5}Sb_{1.5}. Considering that the original structure of $Mg_3(Bi_xSb_{1-x})_2$ (x = 0.5, 1.0, and 1.5) is based on the $1 \times 1 \times 2$ supercell of Mg₃Bi₂, the lattice thermal conductivity was calculated based on the $2 \times 2 \times 1$ supercell. Therefore, for Mg₃Sb₂ and Mg₃Bi₂, we used a $2 \times 2 \times 2$ supercell when calculating the lattice thermal conductivity. In this way, the calculation of the lattice thermal conductivity of Mg₃(Bi_xSb_{1-x})₂($0 \le x \le 1$) can be kept in the same dimension, and the number of atoms in the supercell is 40. For the purpose of comparing the impact of cell size on the calculation of lattice thermal conductivity, we utilized Mg_3Sb_2 as an example and calculated the lattice thermal conductivity of a larger $4 \times 4 \times 3$ supercell using the hiPhive software in combination with phono3py.

The VASP calculation parameters were chosen as follows. The exchange and correlation functions were approximated using the general gradient approximation with Perdew–Burke–Ernzerhof parameterization (GGA-PBE) [62]. The energy cutoff for the plane-wave basis expansion was set to 450 eV. *k*-mesh were produced using VASPKIT [63] in the Gamma scheme at a density of $2\pi \times 0.03$ Å⁻¹. For geometry optimization, a convergence criterion of 1×10^{-5} eV in energy and 1×10^{-4} eV/Å in force was applied. For the calculations of the phonon spectrum and lattice thermal conductivity, a convergence criterion of 1×10^{-8} eV in energy was utilized.

3. Results and Discussions

The formation energies and crystal structures of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$) are presented in Figure 1. The formation energies of $Mg_3(Bi_xSb_{1-x})_2$ were calculated using Equation (2):

$$E_{form} = \left[E_{unitcell}^{Mg_3(Bi_x Sb_{1-x})_2} - 3E_{form}^{Mg} - 2xE_{form}^{Bi} - 2(1-x)E_{form}^{Sb} \right] / 5$$
(2)

In this equation, $E_{unitcell}^{Mg_3(Bi_xSb_{1-x})_2}$ represents the total energy of a single chemical formula $Mg_3(Bi_xSb_{1-x})_2$, and E_{form}^{Mg} , E_{form}^{Bi} , E_{form}^{Sb} denote the single atomic energies of Mg, Bi, and Sb pure constituents, respectively. The structures of Mg, Bi, and Sb were retrieved from the Material Project database [64] and have space groups of P6₃/mmc, R3m, and R3m, respectively. The single atomic energies of the pure constituents Mg, Bi, and Sb are -1.508 eV/atom, -3.9 eV/atom, and -4.13 eV/atom, respectively. As demonstrated in Figure 1, the formation energies of Mg₃(Bi_xSb_{1-x})₂ are negative, indicating thermodynamic favorability.



Figure 1. The formation energies and crystal structures of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$).

Additionally, the formation energy increases linearly as the Bi content increases. Figure 2 illustrates the phonon spectra of $Mg_3(Bi_xSb_{1-x})_2$. With the exception of the negligible imaginary frequency observed for Mg_3BiSb at the L_2 point, the remaining structures exhibit no imaginary frequencies, indicating dynamic stability. Moreover, the absence of a phonon bandgap facilitates a plethora of phonon–phonon scattering processes.



Figure 2. The phonon spectra of $Mg_3(Bi_xSb_{1-x})_2$ for (**a**) x = 0.0; (**b**) x = 0.25; (**c**) x = 0.5; (**d**) x = 0.75; (**e**) x = 1.0.

The Zintl compounds Mg₃Sb₂ and Mg₃Bi₂ share a trigonal CaAl₂Si₂-type structure and belong to the space group $P\overline{3}m1$ [65]. The polyanions $(Mg_2X_2)^{2-}$ (X = Bi, Sb), in which Mg is tetrahedrally coordinated, form covalently bonded layers. These layers are ionically bonded with the octahedrally coordinated Mg²⁺ cation layers, forming the overall framework. Substituting Bi atoms with Sb results in a decrease in system symmetry. As the concentration of Bi increases, the gradual substitution of Bi atoms by Sb atoms occurs in a layer-by-layer manner, resulting in an expansion of the unit cell volume. Figure S1 in the Supplementary Information depicts the average lengths of Mg-X bonds in Mg₃(Bi_xSb_{1-x})₂ $(0 \le x \le 1)$. In the $(Mg_2X_2)^{2-}$ network, the vertical Mg-X bonds are longer than the three symmetry-equivalent tilted Mg-X bonds. In addition, the ionic M-X bonds are longer than the covalent M-X bonds. As the Bi content increases, so does the average bond length between M and X, suggesting a diminished bonding ability between Mg-X and the increased Bi content.

Figure 3a presents the average lattice thermal conductivities of Mg₃(Bi_xSb_{1-x})₂ $(0 \le x \le 1)$ obtained from the BTE utilizing second- and third-order force constants calculated using DFT. These conductivities demonstrate a classical temperature-dependent relationship of T^{-1} instead of a weak temperature-dependent κ_l . It is observed that the order of lattice thermal conductivity is as follows: Mg_3Sb_2 (x = 0) > Mg_3Bi_2 (x = 1) > Mg₃(Bi_xSb_{1-x})₂ (x= 0.25, 0.5, 0.75). Alloying Mg₃Bi₂ with Mg₃Sb₂ significantly reduces the lattice thermal conductivity. We also analyzed the lattice thermal conductivity at 300 K for various Bi contents and compared it with the previous literature [41,54]. Notably, there were marked reductions in the lattice thermal conductivity as the Bi content increased from 0 to 0.25 or decreased from 1.0 to 0.75. However, as the Bi content increased from 0.25 to 0.75, the lattice thermal conductivity showed a slight decrease, indicative of a plateau. Thus, adjusting the Bi content within the range of x = 0.25 to 0.75 may have a negligible effect on the lattice thermal conductivity. Ouyang and colleagues employed ML-IAP to compute the lattice thermal conductivity of the $Mg_3(Bi_xSb_{1-x})_2$ alloy at different alloying concentrations for MCMD structures at 300 K [54]. Our findings are in qualitative concurrence with the experiment [41] and calculation by Ouyang et al., albeit our computed lattice thermal conductivities are comparatively lower. This difference could be due to the reduced size of the supercell employed in the phono3py computations. Due to the

significant computational resources needed for larger supercells when calculating the lattice thermal conductivity, we selected Mg₃Sb₂ as an illustrative example. We assessed the lattice thermal conductivity in a $4 \times 4 \times 3$ supercell using the hiPhive software and the results, demonstrated in Figure 4, generally indicate that the thermal conductivity acquired from the $4 \times 4 \times 3$ supercell using hiPhive exceeds that of the $2 \times 2 \times 2$ supercell calculated using phono3py. Furthermore, the outcomes generated using hiPhive coincide with the calculations carried out by Ouyang et al. [54], even though both sets of calculations produce marginally lower values in comparison to the experimental data [66].



Figure 3. (a) Average lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$) at various temperatures; (b) Average lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ at 300 K for different Bi concentration compared with the experiment [41] and calculation by Ouyang et al. [54].



Figure 4. Average lattice thermal conductivity of Mg_3Sb_2 at various temperatures in $2 \times 2 \times 2$ supercells compared with the hiPhive calculation in $4 \times 4 \times 3$ supercells, experiment [66], and the MD calculation by Ouyang et al. in $2 \times 2 \times 30$ supercells [54].

Figure S2 in the Supplementary Information presents the heat capacity of $Mg_3(Bi_xSb_{1-x})_2$ $(0 \le x \le 1)$ at 300 K. The difference in thermal conductivity mainly arises from the phonon group velocity and phonon lifetime rather than the heat capacity, which exhibits only a small discrepancy. Figures 5 and 6 display the phonon group velocity and phonon lifetime, respectively, of $Mg_3(Bi_xSb_{1-x})_2$. The phonon group velocity distribution range remains similar when x equals 0.25, 0.5, and 0.75. However, the overall group velocity is lower when compared to x equals 0 and 1.0, with the exception of a few higher group velocities in the low-frequency region. As shown in Figure 5, for x equals 0.25, 0.5, and 0.75, the proportion of phonon group speeds below 100 m/s increases significantly. Although the range of phonon group velocity distributions in Mg₃Sb₂ and Mg₃Bi₂ is consistent, the high-frequency region reveals that Mg₃Bi₂ has a significantly lower phonon lifetime than Mg_3Sb_2 . Consequently, the lattice thermal conductivity of Mg_3Bi_2 is lower than that of Mg₃Sb₂. For x = 0.25, 0.5, and 0.75, the lifetime distribution pattern of phonons in $Mg_3(Bi_xSb_{1-x})_2$ is similar, with the distribution interval falling within the same range. Nonetheless, the overall distribution is lower in comparison to x = 0 and x = 1.0. According to Figure 6, there is a significant increase in the proportion of phonon lifetimes below 1.0 ps at x = 0.25, 0.5, and 0.75. We further examined the mode-Grüneisen parameters of Mg₃(Bi_xSb_{1-x})₂ ($0 \le x \le 1$), as illustrated in Figure 7. We found that compared to Mg_3Sb_2 and Mg_3Bi_2 , there is a significant increase in the proportion of regions in the low-frequency range of $Mg_3(Bi_xSb_{1-x})_2$ with absolute values greater than 10 when x = 0.25, 0.5, and 0.75. This indicates that $Mg_3(Bi_xSb_{1-x})_2$ (x = 0.25, 0.5, and 0.75) exhibits higher anharmonicity. Therefore, as the Bi content increases from 0 to 0.25 or decreases from 1 to 0.75, the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ decreases considerably. However, when the concentration changes from 0.25 to 0.75, the change in lattice thermal conductivity reaches a plateau.



Figure 5. The phonon group velocity of $Mg_3(Bi_xSb_{1-x})_2$ for (a) x = 0.0; (b) x = 0.25; (c) x = 0.5; (d) x = 0.75; (e) x = 1.0.



Figure 6. The phonon lifetime of $Mg_3(Bi_xSb_{1-x})_2$ at 300 K for (**a**) x = 0.0; (**b**) x = 0.25; (**c**) x = 0.5; (**d**) x = 0.75; (**e**) x = 1.0.



Figure 7. The mode-Grüneisen parameters of $Mg_3(Bi_xSb_{1-x})_2$ for (**a**) x = 0.0; (**b**) x = 0.25; (**c**) x = 0.5; (**d**) x = 0.75; (**e**) x = 1.0.

4. Conclusions

We conducted a comprehensive investigation into the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$) using DFT calculations. The average lengths of the Mg-X ionic bonds (d1), vertical Mg-X covalent bonds (d2), and three symmetry-equivalent tilted covalent Mg-X bonds (d3) all increase as the Bi content increases. The formation energies of $Mg_3(Bi_xSb_{1-x})_2$ are all negative, indicating that their crystal structures are

thermodynamically stable. The dynamic stability of these structures is confirmed through the absence of imaginary frequencies in their phonon spectra.

The results from the phono3py calculations reveal that the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ ($0 \le x \le 1$) with different Bi contents follows a descending order as $Mg_3Sb_2 > Mg_3Bi_2 > Mg_3(Bi_xSb_{1-x})_2$ (x = 0.25, 0.5, 0.75). At 300 K, the lattice thermal conductivity of $Mg_3(Bi_xSb_{1-x})_2$ is higher at both the upper and lower bounds of the composition range. The effect of Bi content on the lattice thermal conductivity is negligible for x in the range between 0.25 and 0.75. This trend is directly related to the phonon group velocity and phonon lifetime. The phonon lifetime of Mg_3Sb_2 is higher than that of Mg_3Bi_2 . When x = 0 and x = 1.0, the phonon group velocity and phonon lifetime of $Mg_3(Bi_xSb_{1-x})_2$ are significantly higher compared to the values when x = 0.25, 0.5, and 0.75. When the Bi content increases from 0.25 to 0.75, there is little change in the distribution patterns for the phonon group velocity and phonon lifetime. Despite the increase in Bi content, the distribution range remains consistent, leading to negligible changes in the lattice thermal conductivity.

It is worth noting that the current calculation of lattice thermal conductivity for $Mg_3(Bi_xSb_{1-x})_2$ is based on a relatively small supercell with just 40 atoms. While a qualitative agreement between the calculated results and the experimental results is observed, some excluded phonons with shorter wavelengths lead to lower results due to the simulation box's limitation. Our research contributes not only to the comprehension of thermal transport in $Mg_3(Bi_xSb_{1-x})_2$ but also to the optimization of its thermal conductivity through experimentation.

Supplementary Materials: The following supporting information can be downloaded at https://www.mdpi.com/article/10.3390/nano13222938/s1, Figure S1. (a) Crystal structure model of Mg₃X₂ (X = Sb, Bi); (b) The average lengths of Mg-X ionic bonds ($\overline{d_1}$), vertical Mg-X covalent bonds ($\overline{d_2}$), and three symmetry-equivalent tilted covalent Mg-X bonds ($\overline{d_3}$); Figure S2. The heat capacity of Mg₃(Bi_xSb_{1-x})₂ (0 ≤ x ≤ 1) at 300 K.

Author Contributions: Q.P. and X.-J.C. conceived the project; X.Y. and S.Z. performed the firstprinciples-based calculation and analysis. All authors analyzed the data, discussed the results, wrote the draft, and reviewed and edited the manuscript. All authors have read and agreed to the published version of the manuscript.

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