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Study of phonon transport across Si/Ge interfaces using Full-Band phonon Monte Carlo simulation

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Abstract

A Full Band Monte Carlo simulator has been developed to consider phonon transmission across interfaces disposed perpendicularly to the heat flux. This solver of the Boltzmann transport equation does not require any assumption on the shape the phonon distribution and can naturally consider all phonon transport regimes from the diffusive to the fully ballistic regime. This simulator is used to study single and double Si/Ge heterostructures from the micrometer scale down to the nanometer scale, i.e. in all phonon transport regime from fully diffusive to ballistic. A methodology to determine the thermal conductivity at thermal interfaces is presented.

I Introduction

The management of heat transfer at the nanoscale is crucial for the design and optimization of devices, especially in thermoelectrics [1] and nanoelectronics [2]. However, common macroscopic models such as heat Fourier's formalism [3] that assumes local equilibrium are no longer relevant in nanodevices shorter than the mean free path of phonons [4]. In complex nanostructures, the phonon distributions may thus significantly differ from the Bose Einstein equilibrium statistics, especially if thermal interfaces are likely to play a role in the heat transfer.

Several analytical models are able to capture the out of equilibrium transport regime of heat in homogenous systems [5]–[8]. Beyond this standard case, the modeling of interface thermal resistance, also called the Kapitza's resistance [9], is mainly based on either the Acoustic Mismatch Model (AMM) [10], the Diffusive Mismatch Model (DMM) [11] or their extensions [12], [13][14], [15] [16]. It is only recently that an analytical modeling of heat transfer in heterostructure based on a set of a few parameters relevant at the nanometer scale has been presented [17].

Nevertheless, the most versatile approaches to investigate the thermal transfers at the nanoscale are the use of advanced numerical simulations. Among them, Molecular Dynamics (MD) simulations that calculate the classical trajectory of atoms have been widely applied [18]–[20]. These atomistic and time dependent simulations naturally consider the anharmonicity of phonons via semi-empirical parameters that can now be derived from *ab-initio* methods [21], [22]. However, the application of MD remains limited to systems containing thousands of atoms, i.e. with a typical size in the order of tens of nanometers. The Non Equilibrium Green's Functions framework [23]–[25] is another approach that is able to consider mechanical waves at the nanoscale and thus their possible reflection [24], [26]. In its common form, this method is not time dependent but makes it possible to investigate systems larger than those tractable

with MD. However, the implementation of the anharmonicity of the phonon dispersion in this formalism severely increases the computational burden [27].

The stochastic particle Monte Carlo (MC) method [28]–[30] is an efficient and accurate method to solve the time dependent Boltzmann’s Transport Equation (BTE) much beyond the linear approximation. This semi-classical framework is relevant from the nano to the microscale even in complex geometries in which thermal interfaces are involved [31]–[33]. The phonon dispersion can be either simplified using a parabolic approximation or accurately described using a full band description [34]. Moreover, accurate descriptions of scattering mechanisms and in particular phonon/phonon scattering can be implemented at the particle level considering scattering rates that can be either semi-empirical or derived from ab-initio methods [35] [36].

In the present work, phonon transport in heterostructures have been investigated in all phonon transport regimes by using our Full-Band MC simulation. The implementation of the interface modelling is detailed in section II. Results obtained from MC simulation in both simple and double Si/Ge heterostructures are presented and discussed in section III.

II Modeling of heterostructures

II.1. Definitions based on semi-spherical temperature concept

In accordance with our previous works [17], [34], the present work is based on the concept of pseudo hemispherical (or directional) temperatures. Our definitions of the effective/ballistic thermal conductivities $\kappa_{eff}/\kappa_{ball}$, the total/ballistic thermal conductances and the interface thermal conductance G_{int} which are all related to these hemispherical temperatures are reminded in this section.

Hemispherical temperatures T^+/T^- are defined, even in out-of-equilibrium conditions, as the temperature of phonon sub-populations with a positive/negative (oriented toward the cold/hot thermostat, respectively [17]) giving the same energy density E as that obtained from an equilibrium distribution. Thus, it satisfies the following relationship:

$$E(T^+/T^-) = \sum_{state\ s, \ v_x^s > 0 / v_x^s < 0} \hbar \omega_s f_{BE}(\omega_s, T^+/T^-) \quad (1)$$

where f_{BE} is the Bose-Einstein distribution function and ω_s the phonon angular frequency of state s . It should be mentioned that the most common approach consists in using a local pseudo temperature considering the entire phonon population [34].

In a 1D homogeneous system of length L in contact with a hot thermostat at a hot temperature T_H and a cold one at a cold temperature T_C , the thermal flux Q can be expressed (in all transport regimes) by using these different formula:

$$Q = G_{total} \cdot \Delta T_{contact} = \kappa_{eff} \frac{\Delta T_{contact}}{L} = \kappa_{ballistic} \frac{\Delta T_{local}}{L} = G_{ballistic} \Delta T_{local} \quad (2)$$

where the two temperature differences are defined as follows:

$$\Delta T_{local}(x) = T^+(x) - T^-(x)$$

$$\Delta T_{contacts} = T_H - T_C.$$

For a homogeneous structure in which a temperature bias $\Delta T_{contacts}$ is applied and working at (pseudo) temperature $\bar{T}$, the thermal conductivity $\kappa_{effective}$ is given by:

$$\kappa_{effective} = \frac{Q}{\Delta T_{contacts}} = \frac{\Omega}{(2\pi)^3} \sum_{state\ s} \hbar \omega_s |v_{s,x}| \lambda_{mfp,s} \cdot \frac{\partial f_{BE}}{\partial T}(\omega_s, \bar{T}) \quad (3)$$

where Ω is the volume of the first Brillouin zone, $\lambda_{mfp,s}$ is the mean free path of phonon mode s and $v_{s,x}$ is the phonon group velocity of the state s along the x -direction that is the heat transport direction. The associated conductance G is given by $G = \frac{\kappa_{effective}}{L}$. In a ballistic system $\lambda_{mfp,s} = L/2$ and thus the ballistic conductivity κ_{bal} is given by:

$$\kappa_{bal} = \frac{L}{2} \frac{\Omega}{(2\pi)^3} \sum_{state\ s} \hbar \omega_s |v_{s,x}| \frac{\partial f_{BE}}{\partial T}(\omega_s, \bar{T}) \quad (4)$$

Eq. (3) and (4) are used to compute the semi-analytical results presented in this paper.

In heterostructures, interfaces have their own thermal conductance. The interface thermal conductance is here defined as follows [16]:

$$G_{int} = \frac{Q}{\Delta T^I} = \frac{Q}{T^+(x-\varepsilon) - T^-(x+\varepsilon)} \quad (5)$$

where the local temperature at interface $\Delta T^I = T^+(x - \varepsilon) - T^-(x + \varepsilon)$ is the difference between the hemispherical temperatures on each side of the interface.

II.2. Full-Band description of phonons

In this study, two materials have been investigated: cubic Si and cubic Ge. Performing Full-Band Monte Carlo simulations requires the prior knowledge of the phonon dispersion, phonon group velocity and phonon scattering rates in the full Brillouin zone. The phonon dispersion in both cubic Si and Ge have been calculated by using the Adiabatic Bond Charge Model (ABCM)[37] [38]. The first Brillouin zone was discretized into a set of 29791 ($31 \times 31 \times 31$) wave vectors. The phonon band structure in cubic Ge is shown in Fig. 1a. The details about the fitting method and phonon dispersion in cubic Si are given in Ref. [39].

Fig. 1(a). Phonon dispersion in cubic Ge fitted from ABCM method. (b) Cartography of phonon lifetime in cubic Ge. The colorbar indicates the density of states.

The phonon-phonon scattering rates in cubic Si have been computed by using the Density Functional Theory (DFT) as previously done in [36], [40]. For Ge, the same spectral distribution

as in Si is used (as Si and Ge have the same crystallographic structure) but a proportionality factor on their amplitude was applied to fit the experimental thermal conductivity of Ge at ambient temperature. The spectral phonon lifetimes in Ge used in this work, i.e. the inverse of the phonon scattering rate, are shown in Fig. 1.b.

II.3. Monte Carlo simulation for phonon

The particle Monte Carlo (MC) method is a stochastic method to solve the time dependent Boltzmann Transport Equation (BTE) without any assumption on the shape of the phonon distribution functions. The Full-Band phonon dispersion and scattering rates of the materials were used as inputs for the Monte Carlo simulation. At each simulation time step, the values of the pseudo and hemispherical temperatures at each position in the structure are updated according to the local phonon distributions. The details of the Monte Carlo simulation for phonon employed in this work may be found in Ref.[34].

In addition to the contacts with thermostats, two kinds of boundaries are considered in the MC simulation: semi-infinite and rough boundaries. Semi-infinite boundaries are defined by using periodic boundary conditions. In that purpose a couple of opposite external faces (i.e. that are located face to face) must be defined a priori. At these boundaries, when a particle exits from one face a particle with exactly the same properties is created on the opposite (and associated) face.

In the case of a rough boundary, when a phonon collides with the boundary, two kinds of elastic reflection can occur: specular or diffusive reflection. The probability of a specular reflection for an incident phonon of wave vector $\mathbf{q}_0$ and incident angle θ_0 is provided by the Soffer's model [41]:

$$p_{\text{specular}}(|\mathbf{q}_0|, \cos \theta_0) = \exp(-(2 \cos \theta_0 \Delta |\mathbf{q}_0|)^2) \quad (6)$$

where Δ is an empirical parameter characterizing the roughness of the interface. Here, the value of Δ in both Ge and Si is fixed to 0.5 nm. It should be noted that such a high roughness parameter leads to a quasi-diffusive surface for which the specular reflections are unlikely [34].

In the case of specular reflection, the sign of the component of the reflected phonon wave vector normal to the boundary is reversed, i.e. $q_{j',\perp} = -q_{j,\perp}$, which is not trivial in the case of a Full-Band description if the reflection surface is not oriented along a high symmetry plane of the material. In contrast, the component parallel to the boundary is conserved, i.e. $q_{j',\parallel} = q_{j,\parallel}$. It should be mentioned that as a specular reflection has no effect on the heat flux parallel to the interface, it can also be used to model semi-infinite boundaries. In the case of a diffusive reflection (with a probability of $1 - p_{\text{specular}}$), the reflected phonon wave vector is randomly selected on an iso-energy surface that guarantees both the phonon energy conservation and the orientation condition, i.e. $v_{j',\perp} v_{j,\perp} < 0$ for a reflection. To avoid non-physical accumulation of phonons near the rough boundary, the probability of the final state among the iso-energy states is non-uniform. Indeed, according to the Lambert's law, the probability of the state j' with a reflected angle θ_r is proportional to the component of the group velocity normal to the boundary [34]:

$$p_{\text{diffusive}}(\mathbf{q}_{j'}, \theta_r) \propto |\mathbf{v}_{j'}(\mathbf{q}_{j'})| \cos \theta_r \quad (7)$$

II.4. Heterojunction modeling within Monte Carlo simulation

Fig. 2. Schema of phonon diffusion mechanisms at an interface

As schematized in Fig. 2, the interface between materials A and B is modeled by using the Full band version of the Diffusive Mismatch Model (DMM) [12]. Even if this approach does not capture all the complex physics of heat transfer at an interface [42], in particular inelastic phenomena are neglected, this approach is easy to implement and provides reasonable prediction of interface thermal conductance at ambient temperature [43] [44]. In DMM it is assumed that all transmitted or reflected phonons have undergone a diffusive scattering at the interface (no specular reflection occurs) and the interface scattering is assumed to be elastic. For an incident phonon of wave vector $\mathbf{q}_i$ and angular frequency ω colliding with this interface from the A-side, the spectral transmission probability $T_{A \rightarrow B}(\omega)$ is given by [43]:

$$T_{A \rightarrow B}(\omega) = \frac{I_{B,\mathbf{n}}(\omega)}{I_{A,\mathbf{n}}(\omega) + I_{B,\mathbf{n}}(\omega)} \quad (8)$$

where $I_{A/B,\mathbf{n}}(\omega)$ is expressed by:

$$I_{A,\mathbf{n}}(\omega) = \frac{1}{2} \cdot \frac{\Omega}{(2\pi)^3} \sum_{\text{states } s \text{ in } BZ_A} \delta(\omega_s - \omega) |\mathbf{v}_s \cdot \mathbf{n}| \quad (9)$$

Where $\mathbf{n}$ is a unit vector perpendicular to the interface. The summation is performed over all the phonon states s in the materials A in its entire first Brillouin zone BZ_A .

Hence, when a phonon collides with the interface, one of the reflection (phonon remaining in the same material) or transmission (phonon transferred to the other side of the interface) process is selected randomly according to the transmission probability given by Eq.(9). Then, the wave vector and the mode of the final phonon are randomly selected (independently of the incident state) among the isoenergy states j in the final material with a non-uniform probability P_j to satisfy the Lambert's cosine law (cf. Eq. 7) i.e.: $P_j(\mathbf{q}_{j'}, \theta_r) \propto |\mathbf{v}_{j'}(\mathbf{q}_{j'})| \cos \theta_r$.

II.5. Investigated structures

In this work, homogeneous and heterogeneous nanostructures of length L along the X axis were investigated. In all structures, the thermal flux flows along the X axis. The cells located at the two extrema have their external face placed in contact with a hot thermostat of temperature T_H and a cold thermostat of temperature T_C , respectively.

All nanostructures have square cross-sections. Their width and height are equal to 100 nm. A cubic mesh is employed. First, all structures are uniformly meshed along the X-axis into 20 equally sized cells. Then, the meshing of the heterojunctions is refined in the vicinity of the interfaces and the thermostats. The length of these refined cells located 5 nm around the interfaces are less or equal to 1 nm.

Fig. 3. Homogeneous nanostructures: (a) Cross-plane nanofilm (CPNF). (b) In-plane nanofilm (IPNF). (c) Nanowires (NW). Red/blue faces are hot/cold thermostats, respectively. Transparent external faces: periodic boundaries. Green faces: rough boundaries.

Fig. 4. Heterogeneous nanostructures: (a) Simple heterojunction. (b) Double heterojunction. Red/blue faces are hot/cold thermostats. Transparent external faces: periodic boundaries. Yellow faces: DMM interfaces.

Three configurations of homogeneous nanostructures illustrated in Fig. 3 are studied:

- Cross-plane nanofilms (CPNF) in which periodic boundary conditions are applied along both Y and Z directions to describe semi-infinite boundaries.
- In-plane nanofilms (IPNF) in which periodic boundary conditions are applied for XZ planes to describe semi-infinite boundaries and diffusive boundary conditions are applied to XY planes to represent external faces (rough boundaries).
- Nanowires (NW) in which the diffusive boundary conditions are applied to all XY and XZ planes.

In addition, two different kinds of heterogeneous nanostructures in the cross-plane configuration schematized in Fig. 4 are studied:

- Simple heterojunctions in which a DMM heterojunction (in yellow) is located in the middle of the structure ($x = L/2$) joining two homogeneous bars.

- Double heterojunctions in which three equally long homogeneous bars are joined to form two DMM interfaces at positions $x = L/3$ and $x = 2L/3$.

III Results

III.1. Ge homogeneous nanostructures

As shown previously for Si in Ref [34], Fig. 5 shows the variation of the thermal conductivity of Ge in CPNF, IPNF and NW as a function of the nanostructure length. When the nanostructure length L becomes smaller than a few tens of nanometers which is the order of magnitude of the effective phonon mean free path in these structures, the phonon transport regime tends to be more and more ballistic. For the three nanostructures, the thermal conductivity follows the same behavior, i.e. it tends asymptotically to the ballistic thermal conductivity of Ge (dashed line) that is a linear function of L . In long nanostructures, i.e. much longer than the phonon mean free path, the transport regime becomes diffusive, and the thermal conductivity tends to be L independent in all structures. In CPNF, the thermal conductivity moves towards the experimental conductivity in bulk Ge of $60 \text{ W m}^{-1} \text{ K}^{-1}$ at 300 K [45] and its evolution is consistent with *ab-initio* results from [46] and agrees reasonably with the experimental evolution presented in Ref [47]. In nanostructures IPNFs and NWs, the rough interfaces contribute to reduce the thermal conductivity at large L . Consistently, for a given system length, NWs exhibit a lower conductivity than IPNFs that have a lower conductivity than CPNFs.

Fig. 5. Thermal conductivity of Ge homogeneous nanostructures of the three homogeneous nanostructures as a function of the nanostructure length L .

Fig. 6. The ratio $\kappa_{\text{effective}}/\kappa_{\text{ballistic}}$ as a function of the length L . (a) Si nanostructures (b) Ge nanostructures.

To quantify the transition between the different phonon transport regimes, the evolution of the Knudsen number K_D is widely used. This number, characterizing the degree of ballistics of transport, is defined as the ratio between the effective conductivity $\kappa_{\text{effective}}$ (see Eq. 3) and the ballistic one κ_{bal} (see Eq. 4). It depends on the nanostructures as follows:

$$K_D = \kappa_{\text{effective}}/\kappa_{\text{bal}} = \begin{cases} \kappa_{\text{CPNF}}/\kappa_{\text{bal}} & \text{for CPNF} \\ \kappa_{\text{IPNF}}/\kappa_{\text{bal}} & \text{for IPNF} \\ \kappa_{\text{NW}}/\kappa_{\text{bal}} & \text{for NW} \end{cases} \quad (10)$$

The values of K_D obtained from our MC code are plotted in Fig. 6 for different nanostructures of length L varying from 1 nm to 1 μm made of Si (a) and Ge (b).

As expected, the value of K_D decreases monotonically from 1 in ultra-short systems where a fully ballistic transport regime occurs down to 0 (i.e. smaller than 0.1) in long systems in which the transport is fully diffusive. The intermediate transport regime is defined here as the regime where K_D values are comprised between 0.8 ($L > 10$ nm) and 0.1 ($L < 1 \mu\text{m}$).

III.2. Simple Si/Ge heterostructure

Fig. 7 shows the profiles of the pseudo temperature T and the two hemispherical temperatures T^+ and T^- in a 100 nm long Ge/Si heterojunction. The Ge bar is in contact with a hot thermostat at temperature $T_H = 302$ K and the Si bar is in contact with a cold thermostat at temperature $T_C = 298$ K. Along the two homogenous bars, the different temperatures vary continuously whereas they exhibit an abrupt drop at the interface. More surprisingly, all the considered temperatures do not evolve strictly linearly along the bars but have a significant curvature near the interface, particularly in the Ge side that has a lower thermal conductivity than Si. Thus, a coarse mesh around the interface could lead to a significant overestimation of the temperature drop at the interface and an underestimation of the related interface thermal conductance. For this reason, the refinement of the mesh in the vicinity of the interfaces is mandatory.

Fig. 7. Temperature profiles in a 100 nm long Ge/Si heterojunction

For a 20 nm long Si/Ge heterojunction, the heat flux resulting from Monte Carlo simulation is plotted in Fig. 8.a for different temperature differences ($T_H - T_C$) between thermostats while keeping the average temperature at 300 K. The Si/Ge heterojunction was considered for both configurations: (i) T_H :Ge/ T_C :Si in which the Ge bar is in contact with the hot thermostat while the Si bar is in contact with the cold thermostat; and (ii) T_H :Si/ T_C :Ge in which the Si bar is in contact with the hot thermostat while the Ge bar is in contact with the cold thermostat.

Fig. 8.a clearly shows a linear relationship between the heat flux density and the temperature difference ($T_H - T_C$) for both thermal biases. By using linear regressions, the following relationships are obtained:

- i. T_H :Ge/ T_C :Si : $Q = (191.30 \text{ MW} \cdot \text{m}^{-2} \cdot \text{K}^{-1})(T_H - T_C) + 14.40 \text{ MW} \cdot \text{m}^{-2}$
- ii. T_H :Si/ T_C :Ge : $Q = (191.35 \text{ MW} \cdot \text{m}^{-2} \cdot \text{K}^{-1})(T_H - T_C) - 16.24 \text{ MW} \cdot \text{m}^{-2}$

A total thermal conductance of $191 \text{ MW} \cdot \text{m}^{-2} \cdot \text{K}^{-1}$, independent of the temperature difference configuration, is thus obtained in these 20 nm-long heterojunction. Due to the numerical nature of the Monte Carlo method, the heat flux density at zero temperature bias does not vanish, but it takes a finite value around $\pm 16 \text{ MW} \cdot \text{m}^{-2}$ in this device. We thus assume that this value corresponds to the maximum numerical resolution δQ of our simulation. Besides, in a MC algorithm the interval of 95% confidence of the flux called $IC_{95}Q$ can be reduced as small as expected if the number of samples is large enough. Finally, the error bars for heat flux density are defined here as $Errorbar_Q = \min\{\delta Q, IC_{95}Q\}$. Similarly, the error bars for the interface thermal conductance are defined by summing:

$$\frac{\delta G_{int}}{G_{int}} = \frac{\delta Q}{Q} + \frac{\delta(\Delta T^I)}{\Delta T^I} \quad (11)$$

where our estimation of $\delta(\Delta T^I)$ is $\delta T \approx \delta Q / G_{tot}$.

Fig. 8. (a) Heat flux density and (b) interface thermal conductance in a 20 nm – long Si/Ge heterojunction for different temperature differences ($T_H - T_C$). N.B.: $(T_H + T_C)/2 = 300$ K

Fig. 8.b presents the interface thermal conductance as a function of the temperature difference ($T_H - T_C$). For a temperature difference greater than or equal to 2K, the interface thermal conductance converges to a value of about 240 $\text{MW.m}^{-2}.\text{K}^{-1}$ (or a resistance of 4.2×10^9 K.m/W) that is consistent with the experimental value of Refs. [27], [44], [48]. Although the error bars are large at low temperature bias, due to the numerical fluctuations inherent in the Monte Carlo method, the value of G_{int} is still within the error bars, indicating that G_{int} is independent on the temperature difference ($T_H - T_C$). In Ref. [49] a rectification of 5% was estimated by using MD at Si/Ge interfaces. This effect could be due to (i) the asymmetric phonon distributions on each side of the interface, phenomenon captured by our approach, and/or (ii) the inelastic scattering at the interfaces that is not included here. As there is an overlap of the error bar extension in the two thermal configurations, it is difficult to conclude here. Nevertheless, a small thermal rectification of less than 5% is compatible with the results observed in Fig. 9.b.

A set of Si/Ge heterojunctions of length L varying from 1 nm to 1 μm with thermostat temperatures of $T_H = 302$ K and $T_C = 298$ K have been also considered. The heat flux density of the heterojunctions as a function of the heterostructure length L is plotted Fig. 9.a. In ultra-short heterostructures ($L < 10$ nm), the heat flux density Q approaches the value of 1 GWm^{-2} in ballistic regime. In long heterostructures ($L > 200$ nm) in which the heat transport is diffusive, the heat flux density tends to be proportional to $1/L$ consistently with the classical Fourier's law. The related thermal conductances G_{int} are plotted in Fig. 9.b. As the values of G_{int} remains within the error bars, the interface thermal conductance takes average values close to 240 $\text{MWm}^{-2}\text{K}^{-1}$ for both temperature difference configurations and for all lengths L . Once again, no significant thermal rectification is observed with respect to the error bars of around 5%. It is noted that the width of the error bars is larger for long heterostructures (in which ΔT^I of Eq. 11 are low) than for short ones.

Another interesting thermal parameter of an interface is its Kapitza length l defined as $l = \kappa_{\text{diffusive}} / G_{\text{int}}$, where $\kappa_{\text{diffusive}}$ is the thermal conductivity. It corresponds to the length of a homogeneous bar made of material exhibiting the same thermal conductance as one interface. Here, the Kapitza lengths are 540 nm and 250 nm in Si and Ge, respectively. In long device, longer than the Kapitza length of the interface, the presence of the interfaces becomes negligible

and the heat flux, presented in Fig. 9.a, tends to evolve as $1/L$. In short devices, it tends to be size independent. Indeed, the interface conductance limits the flux and not the ballistic one as in homogenous devices.

Fig. 9. (a) Heat flux density and (b) interface thermal conductance of Si/Ge heterojunction as a function of the heterostructure length L ($T_H=302$ K, $T_C=298$ K).

III.3. Double Si/Ge heterostructures

To study more complex systems, several heterostructures with two Si/Ge interfaces, schematized in Fig. 4.b, have been investigated. The temperature profiles in a 300 nm long Ge-Si-Ge double heterojunction are plotted in Fig. 10. The temperature profiles in both Ge parts are similar as well as the temperature drops at the two interfaces. As previously observed in simple heterostructures, the temperature gradients are smaller in the more conductive Si part and significant curvatures of the temperature profiles are present in the vicinity of the interface, in particular on the Ge side. In addition, the T gradient is always slightly higher than the T^+ and T^- ones.

Fig. 10. Temperature profile in Ge/Si/Ge double heterojunction.

According to our Monte Carlo results, the total thermal flux density flowing through the double heterojunction is $240 \pm 21 \text{ MWm}^{-2}$. The calculated values for the two interface thermal conductances are $G_I = 271 \pm 32 \text{ MWm}^{-2}\text{K}^{-1}$ (at $x = 100 \text{ nm}$) and $G_2 = 235 \pm 28 \text{ MWm}^{-2}\text{K}^{-1}$ (at $x = 200 \text{ nm}$). With respect to the value extracted in simple heterostructures (of $240 \text{ MWm}^{-2}\text{K}^{-1}$), the values obtained for double heterostructures remain within the error bars of the method.

In addition, the effective thermal conductivities of the Ge and Si bars are $17.3 \pm 1.7 \text{ Wm}^{-1}\text{K}^{-1}$, $46.9 \pm 5.9 \text{ Wm}^{-1}\text{K}^{-1}$ and $17.3 \pm 1.7 \text{ Wm}^{-1}\text{K}^{-1}$, for the left Ge bar ($0 \leq x \leq 100 \text{ nm}$), the middle Si bar ($100 \text{ nm} \leq x \leq 200 \text{ nm}$), and the right Ge bar ($200 \text{ nm} \leq x \leq 300 \text{ nm}$), respectively. These results match the values obtained in 100 nm long CPNF and shown in Ref [34] and Fig. 5, respectively. They illustrate the relevance of our simulation methodology even in the presence of several interfaces.

Fig. 11. Total conductance of simple and double Si/Ge heterojunctions cf. Fig 4 of various lengths L at $T=300 \text{ K}$.

It is important to note that this consistency of MC results in terms of interface conductance and thermal conductivity has been obtained thanks to the refinement of the space meshing near the interface associated with the use of the hemispherical temperatures. Otherwise, the computed interface thermal conductance would appear artificially size dependent (not shown).

Finally, in Fig. 11, the total conductance of the simple and double heterostructures computed by using our MC simulations, is plotted as a function of the device length L . In ultra-small devices working in ballistic transport regime, the total conductance in heterostructures tends to become size independent and governed by the Si/Ge interface conductance. Indeed, in the single ultra-short heterostructures, we find a thermal conductance value of about $240 \text{ MW/m}^2/\text{K}$ which corresponds to that of a Si/Ge interface. It is interesting to note that in the double ultrashort heterostructures, the value of the total conductance is higher than those of the single heterostructure divided by two, which would be the result if we had just two interface conductances in series. This indicates that when the interfaces are too close together, they are less effective at stopping heat transport, because the phonon transport is far from equilibrium between the two interfaces.

In long device, much longer than the Kapitza length of the interface, the presence of the interfaces becomes negligible. The main advantage of the presented MC approach lies in its ability to describe the heat transfer in the intermediate regime even in complex geometries such as double heterostructures of few tens of nanometers length.

IV Conclusion

A Full Band Monte Carlo simulator able to consider phonon transmission across interfaces disposed perpendicularly to the heat flux has been presented. In the present work, the phonon transmissions were computed by using a Full band version of the DMM formalism.

Simulations have been used to study single and double heterostructures made of Si/Ge interfaces. A clear methodology has been developed to extract relevant results from the numerical output data. By considering the hemispherical temperatures, i.e. by distinguishing the phonons by the direction of their displacement and by carefully refining the mesh around the interfaces to properly capture the curvature of the temperature profiles, we have calculated accurate values of thermal interface conductance that are not size dependent or heterostructure dependent, as expected.

This original Monte Carlo simulator providing a deep insight of the phonon transport can be used to study complex geometries with many interfaces of different types: rough/specular, reflecting, or semi-transparent interfaces. In addition to the spectral analysis of phonon transport [38], it opens the way to the investigation of the transient aspects of heat conduction in semiconductor devices.

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Data availability

The data that support the findings of this study are available from the corresponding author upon reasonable request.

References

- [1] W. Liu, Q. Jie, H. S. Kim, and Z. Ren, “Current progress and future challenges in thermoelectric power generation: From materials to devices,” *Acta Materialia*, vol. 87, pp. 357–376, Apr. 2015, doi: 10.1016/j.actamat.2014.12.042. [Online]. Available: <https://linkinghub.elsevier.com/retrieve/pii/S1359645414009689>. [Accessed: 25-Nov-2020]
- [2] “THE INTERNATIONAL ROADMAP FOR DEVICES AND SYSTEMS:MORE MOORE Report 2017,” IRDS, 2017 [Online]. Available: https://irds.ieee.org/images/files/pdf/2017/2017IRDS_MM.pdf
- [3] J. B. J. baron Fourier, *Théorie analytique de la chaleur*. F. Didot, 1822.

- [4] D. G. Cahill *et al.*, “Nanoscale thermal transport. II. 2003–2012,” *Applied Physics Reviews*, vol. 1, no. 1, p. 011305, Mar. 2014, doi: 10.1063/1.4832615. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4832615>. [Accessed: 26-Sep-2019]
- [5] J. Kaiser, T. Feng, J. Maassen, X. Wang, X. Ruan, and M. Lundstrom, “Thermal transport at the nanoscale: A Fourier’s law vs. phonon Boltzmann equation study,” *Journal of Applied Physics*, vol. 121, no. 4, p. 044302, Jan. 2017, doi: 10.1063/1.4974872. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4974872>. [Accessed: 17-Jul-2020]
- [6] J.-P. M. Péraud and N. G. Hadjiconstantinou, “Extending the range of validity of Fourier’s law into the kinetic transport regime via asymptotic solution of the phonon Boltzmann transport equation,” *Phys. Rev. B*, vol. 93, no. 4, p. 045424, Jan. 2016, doi: 10.1103/PhysRevB.93.045424. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevB.93.045424>. [Accessed: 07-Sep-2020]
- [7] A. T. Ramu and J. E. Bowers, “A Generalized Enhanced Fourier Law,” *Journal of Heat Transfer*, vol. 139, no. 3, p. 034501, Mar. 2017, doi: 10.1115/1.4034796. [Online]. Available: <https://asmedigitalcollection.asme.org/heattransfer/article/doi/10.1115/1.4034796/449448/A-Generalized-Enhanced-Fourier-Law>. [Accessed: 17-Jul-2020]
- [8] J. Ordonez-Miranda, R. Yang, and J. J. Alvarado-Gil, “A constitutive equation for nano-to-macro-scale heat conduction based on the Boltzmann transport equation,” *Journal of Applied Physics*, vol. 109, no. 8, p. 084319, Apr. 2011, doi: 10.1063/1.3573512. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.3573512>. [Accessed: 02-Sep-2020]
- [9] P. Kapitza, “The study of heat transfer in helium II,” *J. Phys.(USSR)*, vol. 4, no. 1–6, pp. 181–210, 1941.
- [10] W. A. Little, “The transport of heat between dissimilar solids at low temperatures,” *Canadian Journal of Physics*, vol. 37, no. 3, pp. 334–349, 1959 [Online]. Available: <http://www.nrcresearchpress.com/doi/abs/10.1139/p59-037>. [Accessed: 01-Sep-2017]
- [11] E. T. Swartz and R. O. Pohl, “Thermal boundary resistance,” *Reviews of modern physics*, vol. 61, no. 3, p. 605, 1989 [Online]. Available: <http://journals.aps.org/rmp/abstract/10.1103/RevModPhys.61.605>. [Accessed: 25-Feb-2016]
- [12] P. Reddy, K. Castelino, and A. Majumdar, “Diffuse mismatch model of thermal boundary conductance using exact phonon dispersion,” *Applied Physics Letters*, vol. 87, no. 21, p. 211908, 2005, doi: 10.1063/1.2133890. [Online]. Available: <http://scitation.aip.org/content/aip/journal/apl/87/21/10.1063/1.2133890>. [Accessed: 03-Dec-2015]
- [13] J. Larroque, P. Dollfus, and J. Saint-Martin, “Phonon transmission at Si/Ge and polytypic Ge interfaces using full-band mismatch based models,” *Journal of Applied Physics*, vol. 123, no. 2, p. 025702, Jan. 2018, doi: 10.1063/1.5007034. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.5007034>. [Accessed: 26-Sep-2019]
- [14] S. Merabia and K. Termentzidis, “Thermal conductance at the interface between crystals using equilibrium and nonequilibrium molecular dynamics,” *Physical Review B*, vol. 86, no. 9, Sep. 2012, doi: 10.1103/PhysRevB.86.094303. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevB.86.094303>. [Accessed: 11-Sep-2017]
- [15] G. Chen, “Thermal conductivity and ballistic-phonon transport in the cross-plane direction of superlattices,” *Phys. Rev. B*, vol. 57, no. 23, pp. 14958–14973, Jun. 1998, doi: 10.1103/PhysRevB.57.14958. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevB.57.14958>. [Accessed: 01-Oct-2019]
- [16] C. Hua and A. J. Minnich, “Semi-analytical solution to the frequency-dependent Boltzmann transport equation for cross-plane heat conduction in thin films,” *Journal of*

- Applied Physics*, vol. 117, no. 17, p. 175306, May 2015, doi: 10.1063/1.4919432. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4919432>. [Accessed: 27-Nov-2019]
- [17] B. Davier *et al.*, “Revisiting thermal conductivity conductance at the nanoscale Homogenous system,” *arXiv*, 2020.
- [18] Y. Chalopin, K. Esfarjani, A. Henry, S. Volz, and G. Chen, “Thermal interface conductance in Si/Ge superlattices by equilibrium molecular dynamics,” *Physical Review B*, vol. 85, no. 19, p. 195302, May 2012, doi: 10.1103/PhysRevB.85.195302. [Online]. Available: <http://link.aps.org/doi/10.1103/PhysRevB.85.195302>. [Accessed: 10-Dec-2014]
- [19] D. P. Sellan, E. S. Landry, J. E. Turney, A. J. H. McGaughey, and C. H. Amon, “Size effects in molecular dynamics thermal conductivity predictions,” *Physical Review B*, vol. 81, no. 21, p. 214305, Jun. 2010, doi: 10.1103/PhysRevB.81.214305. [Online]. Available: <http://link.aps.org/doi/10.1103/PhysRevB.81.214305>. [Accessed: 09-Dec-2015]
- [20] E. S. Landry and A. J. H. McGaughey, “Thermal boundary resistance predictions from molecular dynamics simulations and theoretical calculations,” *Physical Review B*, vol. 80, no. 16, pp. 165304–1, Oct. 2009, doi: 10.1103/PhysRevB.80.165304. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevB.80.165304>. [Accessed: 11-Sep-2017]
- [21] B. Qiu and X. Ruan, “Molecular dynamics simulations of lattice thermal conductivity of bismuth telluride using two-body interatomic potentials,” *PHYSICAL REVIEW B*, p. 6.
- [22] T.-Q. Duong, C. Massobrio, G. Ori, M. Boero, and E. Martin, “Thermal resistance of an interfacial molecular layer by first-principles molecular dynamics,” *The Journal*, p. 6, 2020.
- [23] N. Mingo, L. Yang, D. Li, and A. Majumdar, “Predicting the Thermal Conductivity of Si and Ge Nanowires,” *Nano Letters*, vol. 3, no. 12, pp. 1713–1716, Dec. 2003, doi: 10.1021/nl034721i. [Online]. Available: <http://pubs.acs.org/doi/abs/10.1021/nl034721i>. [Accessed: 01-Jul-2015]
- [24] F. Mazzamuto *et al.*, “Enhanced thermoelectric properties in graphene nanoribbons by resonant tunneling of electrons,” *Phys. Rev. B*, vol. 83, no. 23, p. 235426, Jun. 2011, doi: 10.1103/PhysRevB.83.235426. [Online]. Available: <http://link.aps.org/doi/10.1103/PhysRevB.83.235426>
- [25] A. Alkurdi, S. Pailhès, and S. Merabia, “Critical angle for interfacial phonon scattering: Results from *ab initio* lattice dynamics calculations,” *Applied Physics Letters*, vol. 111, no. 9, p. 093101, Aug. 2017, doi: 10.1063/1.4997912. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4997912>. [Accessed: 11-Sep-2017]
- [26] J. Carrete *et al.*, “Phonon transport across crystal-phase interfaces and twin boundaries in semiconducting nanowires,” *Nanoscale*, vol. 11, no. 34, pp. 16007–16016, 2019, doi: 10.1039/C9NR05274G. [Online]. Available: <http://xlink.rsc.org/?DOI=C9NR05274G>. [Accessed: 09-Dec-2020]
- [27] Y. Lee *et al.*, “Quantum treatment of phonon scattering for modeling of three-dimensional atomistic transport,” *PHYSICAL REVIEW B*, p. 6, 2017.
- [28] S. Mazumder and A. Majumdar, “Monte Carlo Study of Phonon Transport in Solid Thin Films Including Dispersion and Polarization,” *Journal of Heat Transfer*, vol. 123, no. 4, p. 749, 2001, doi: 10.1115/1.1377018. [Online]. Available: <http://HeatTransfer.asmedigitalcollection.asme.org/article.aspx?articleid=1445087>. [Accessed: 13-Jul-2016]
- [29] D. Lacroix, K. Joulain, and D. Lemonnier, “Monte Carlo transient phonon transport in silicon and germanium at nanoscales,” *Physical Review B*, vol. 72, no. 6, Aug. 2005, doi: 10.1103/PhysRevB.72.064305. [Online]. Available: <http://link.aps.org/doi/10.1103/PhysRevB.72.064305>. [Accessed: 05-Jul-2016]

- [30] J.-P. M. Péraud, C. D. Landon, and N. G. Hadjiconstantinou, “Monte carlo methods for solving the boltzmann transport equation,” *Annual Review of Heat Transfer*, vol. 17, pp. 205–265, 2014, doi: <http://dx.doi.org/10.1615/AnnualRevHeatTransfer.2014007381>. [Online]. Available: [http://www.dl.begellhouse.com/pt/download/article/1d883b612ccfafde/ARHT\(7\)-7381.pdf](http://www.dl.begellhouse.com/pt/download/article/1d883b612ccfafde/ARHT(7)-7381.pdf). [Accessed: 02-Nov-2015]
- [31] X. Ran, Y. Guo, Z. Hu, and M. Wang, “Interfacial Phonon Transport Through Si/Ge Multilayer Film Using Monte Carlo Scheme With Spectral Transmissivity,” *Front. Energy Res.*, vol. 6, p. 28, May 2018, doi: 10.3389/fenrg.2018.00028. [Online]. Available: <http://journal.frontiersin.org/article/10.3389/fenrg.2018.00028/full>. [Accessed: 21-Oct-2019]
- [32] M.-S. Jeng, R. Yang, D. Song, and G. Chen, “Modeling the Thermal Conductivity and Phonon Transport in Nanoparticle Composites Using Monte Carlo Simulation,” *J. Heat Transfer*, vol. 130, no. 4, p. 042410, 2008, doi: 10.1115/1.2818765. [Online]. Available: <http://HeatTransfer.asmedigitalcollection.asme.org/article.aspx?articleid=1449099>. [Accessed: 18-Dec-2020]
- [33] T. Hori, J. Shiomi, and C. Dames, “Effective phonon mean free path in polycrystalline nanostructures,” *Appl. Phys. Lett.*, vol. 106, no. 17, p. 171901, Apr. 2015, doi: 10.1063/1.4918703. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4918703>. [Accessed: 18-Dec-2020]
- [34] B. Davier *et al.*, “Heat transfer in rough nanofilms and nanowires using full band *ab initio* Monte Carlo simulation,” *Journal of Physics: Condensed Matter*, vol. 30, no. 49, p. 495902, Dec. 2018, doi: 10.1088/1361-648X/aaea4f.
- [35] L. Yang and A. J. Minnich, “Thermal transport in nanocrystalline Si and SiGe by *ab initio* based Monte Carlo simulation,” *Scientific Reports*, vol. 7, p. 44254, Mar. 2017, doi: 10.1038/srep44254. [Online]. Available: <http://www.nature.com/articles/srep44254>. [Accessed: 16-Mar-2017]
- [36] L. Chaput, J. Larroque, P. Dollfus, J. Saint-Martin, and D. Lacroix, “*Ab initio* based calculations of the thermal conductivity at the micron scale,” *Appl. Phys. Lett.*, vol. 112, no. 3, p. 033104, Jan. 2018, doi: 10.1063/1.5010959.
- [37] W. Weber, “Adiabatic bond charge model for the phonons in diamond, Si, Ge, and α -Sn,” *Physical Review B*, vol. 15, no. 10, pp. 4789–4803, 1977, doi: 10.1103/PhysRevB.15.4789.
- [38] A. Valentin, J. Sée, S. Galdin-Retailleau, and P. Dollfus, “Study of phonon modes in silicon nanocrystals using the adiabatic bond charge model,” *J. Phys.: Condens. Matter*, vol. 20, no. 14, p. 145213, Apr. 2008, doi: 10.1088/0953-8984/20/14/145213.
- [39] J. Larroque, P. Dollfus, and J. Saint-Martin, “Full-Band modelling of phonons in polytype Ge and Si,” *J. Phys.: Conf. Ser.*, vol. 906, p. 012007, Oct. 2017, doi: 10.1088/1742-6596/906/1/012007.
- [40] A. Togo, L. Chaput, and I. Tanaka, “Distributions of phonon lifetimes in Brillouin zones,” *Phys. Rev. B*, vol. 91, no. 9, p. 094306, Mar. 2015, doi: 10.1103/PhysRevB.91.094306.
- [41] S. B. Soffer, “Statistical Model for the Size Effect in Electrical Conduction,” *Journal of Applied Physics*, vol. 38, no. 4, pp. 1710–1715, Mar. 1967, doi: 10.1063/1.1709746.
- [42] S. Sadasivam *et al.*, “Thermal transport across metal silicide-silicon interfaces: First-principles calculations and Green’s function transport simulations,” *Phys. Rev. B*, vol. 95, no. 8, p. 085310, Feb. 2017, doi: 10.1103/PhysRevB.95.085310. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevB.95.085310>. [Accessed: 15-Feb-2021]
- [43] J. Larroque, P. Dollfus, and J. Saint-Martin, “Phonon transmission at Si/Ge and polytypic Ge interfaces using full-band mismatch based models,” *Journal of Applied Physics*, vol. 123, no. 2, pp. 025702–025702, 2018, doi: 10.1063/1.5007034.

- [44] G. Pernot *et al.*, “Precise control of thermal conductivity at the nanoscale through individual phonon-scattering barriers,” *Nature Mater*, vol. 9, no. 6, pp. 491–495, Jun. 2010, doi: 10.1038/nmat2752. [Online]. Available: <http://www.nature.com/articles/nmat2752>. [Accessed: 30-Mar-2021]
- [45] C. J. Glassbrenner and G. A. Slack, “Thermal Conductivity of Silicon and Germanium from 3°K to the Melting Point,” *Phys. Rev.*, vol. 134, no. 4A, pp. A1058–A1069, May 1964, doi: 10.1103/PhysRev.134.A1058.
- [46] B. Vermeersch, J. Carrete, and N. Mingo, “Cross-plane heat conduction in thin films with *ab-initio* phonon dispersions and scattering rates,” *Appl. Phys. Lett.*, vol. 108, no. 19, p. 193104, May 2016, doi: 10.1063/1.4948968. [Online]. Available: <http://aip.scitation.org/doi/10.1063/1.4948968>. [Accessed: 01-Oct-2019]
- [47] J. A. Johnson *et al.*, “Direct Measurement of Room-Temperature Nondiffusive Thermal Transport Over Micron Distances in a Silicon Membrane,” *Phys. Rev. Lett.*, vol. 110, no. 2, p. 025901, Jan. 2013, doi: 10.1103/PhysRevLett.110.025901. [Online]. Available: <https://link.aps.org/doi/10.1103/PhysRevLett.110.025901>. [Accessed: 30-Mar-2021]
- [48] M. Goto *et al.*, “Ultra-low thermal conductivity of high-interface density Si/Ge amorphous multilayers,” *Appl. Phys. Express*, vol. 11, no. 4, p. 045202, Apr. 2018, doi: 10.7567/APEX.11.045202. [Online]. Available: <https://iopscience.iop.org/article/10.7567/APEX.11.045202>. [Accessed: 11-Dec-2020]
- [49] R. Rurali, X. Cartoixa, and L. Colombo, “Heat transport across a SiGe nanowire axial junction: Interface thermal resistance and thermal rectification,” *Physical Review B*, vol. 90, no. 4, Jul. 2014, doi: 10.1103/PhysRevB.90.041408. [Online]. Available: <http://link.aps.org/doi/10.1103/PhysRevB.90.041408>. [Accessed: 04-Dec-2015]