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Parametric study of the Two-Temperature Model for Molecular Dynamics simulations of collisions cascades in Si and Ge

Thomas Jarrin^{a,b,*}, Antoine Jay^b, Anne Hémeryck^b, Nicolas Richard^a

^aCEA, DAM, DIF, F-91297 Arpajon, France ^bLAAS-CNRS, Université de Toulouse, CNRS, Toulouse, France

Abstract

The sensitivity of collision cascades simulations to the Two-Temperature Model main parameters is investigated by performing an extensive statistical study both in Si and Ge materials. The purpose is to identify the parameters of the Two-Temperature Model whose impact is the most significant on the cascades properties and to discuss the physical role of each parameter. We demonstrate that the electronic stopping power and electron phonon coupling have a drastic impact both in Si and Ge but that these two parameters act differently on those two materials due to their distinct thermal properties. We show that the formation of thermal spikes and therefore of amorphous pockets is sensitive to the electronic specific heat. The effects are again very distinct in Si and in Ge. The influence of both the threshold velocity for the stopping power and the electron-phonon coupling activation time are found to be negligible at the considered energies.

Keywords: collision cascades, displacement damage, semiconductors, molecular dynamics, two-temperature model, electronic effects

1. Introduction

In a highly radiative environment such as space or nuclear plants, micro and optoelectronic components can be subjected to Displacement Damage (DD) effects [1]. DD is described as a perturbation of the crystalline lattice by the interaction with incident energetic particles (neutrons, protons, ions). A similar effect can appear during ion implantation into Si wafers for example, where the incoming ion induces DD in the lattice of the target material. For more than thirty years, Molecular Dynamics (MD) simulations have proven themselves to be a very appropriate tool for the simulations of collision cascades in materials, and thus for the detailed understanding of DD [2, 3]. Collision cascades initiated by a Primary Knock-On Atom (PKA) in Si and Ge have been extensively studied with MD [2, 4, 5], giving a qualitative picture of the mechanisms at stake in those materials.

However, an important aspect of the collision cascades that is often neglected in MD simulations is the presence of electronic excitations and deexcitations. Electronic excitations lead to the kinetic energy loss of moving atoms via the electronic stopping power whereas electronic deexcitations allow a part of the energy stored by the electrons to be fed back to the atoms via the electron-phonon coupling [6]. According to SRIM [7], in Si, a 10 keV self recoil loses 18% of its energy to electronic excitations, it goes up

*Corresponding author Email address: thomas.jarrin@cea.fr (Thomas Jarrin)

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to 40% for a 100 keV self recoil and 66% for a 500 keV self recoil. Electronic excitations are therefore far from being negligible in the energy range spanned by collision cascades.

The model which has certainly been the most employed for coping with electronic excitations in MD simulations of collision cascades is the Two-Temperature Model (TTM) [8]. The model lies on the splitting of the system into an ionic and an electronic subsystem. Two temperatures are defined based on this splitting: an atomic temperature T_a and an electronic temperature T_e . The electronic temperature follows a standard heat equation whose main parameter is the electronic specific heat C_e . The electronic and ionic subsystems can exchange energy through the electronic stopping power γ_s , applied only on atoms whose velocities are above a threshold one v_0 , and through the electron-phonon coupling γ_p .

The TTM was initially developed for metals and applied to Fe [9], W [10], Ni and NiFe [11] to cite a few examples. The use of the TTM for band gap materials is still being debated as the charge carriers transport is not explicitly tracked and the band gap not considered [12]. However, Khara *et al.* have shown in [13] that the band gap effects are accounted for through C_e . Moreover, the TTM developed by Duffy *et al.* in [8] has already been applied in its original form with success [5, 13, 14] or in a slightly revised way [15, 16] to band gap materials. In this article, we employ the original version of the TTM developed by Duffy *et al.* in [8] to Si and Ge in order to provide results and discussions useful for the largest possible range

of TTM users.

Some recent studies have tested TTM-based models complexified by the addition of new parameters [11, 17]. We made the choice to stay true to the most employed version of the TTM (*i.e.* the one developed by Duffy etal. in [8]). The only parameter not present in the Duffy et al. version of the TTM we use is the activation time of the electron-phonon coupling (t_{eph}) which acts to delay by a fraction of picosecond the time at which the electronphonon coupling is activated (Zarkadoula et al. set it between 0.2 ps and 1 ps in their works [11, 10, 18] and whose use is vivedly recommended [11] and well spread in the community [17, 10, 18, 19]. Experiments [20, 21] and MD simulations [2] have showed that the response of Si and Ge materials to particle irradiation is very unalike because of their different thermal properties [4]. The impact of the TTM in both material is therefore expected to be dissimilar.

Despite the fact that the TTM is becoming common to take into account the electronic effects in MD simulations, very few studies have been entirely dedicated to a systematic study of the effects of the TTM parameters on collision cascades: Khara *et al.* studied in [13] the effects of C_e on Swift Heavy Ions (SHI) irradiation in Si, Zarkadoula et al. explored in [11] the effects of electron-phonon coupling in Ni and NiFe. In W, Cui et al. studied in [17] the impact of electronic stopping power and Sand et al. explored in [22] and [23] the effects of v_0 on the production of defects with models similar to the TTM. No extensive statistical study considering large enough number of simulations to overcome the high stochasticity of the cascades has been dedicated to the impact of the TTM parameters on collision cascades, especially in semiconducting materials. Such a study would be very valuable considering the lack of reliable experimental or theoretical values and the uncertainty in the methods to determine some TTM parameters in even simple materials which can compel to make choices by default without always having a clear view on the implications. For instance, in Si and in Ge, apart from γ_s which can be accurately and easily determined with SRIM [7], the best choices for the values of all other parameters are not completely satisfactory:

- Experimentally fitted theoretical values for C_e available in [24] span a very narrow range of temperatures (800 K to 1600 K for Si, 500 K to 1200 K for Ge whereas temperature ranges attainable in our MD simulations go from 300 K to 80 000 K).
- Two values different by nearly a factor three for γ_p have been used for Monte-Carlo simulations of SHI irradiation in Si [25, 26].
- The best methods to determine the t_{eph} and v_0 parameters are still subject to debate [11, 17].

In this work, a parametric statistical study of the γ_s , γ_p , C_e , v_0 and t_{eph} TTM parameters impact on collision

cascades both in Si and Ge materials is performed by running TTM-MD simulations initiated by 10 keV PKAs. This study seeks to:

(i) Assess the sensitivity to the TTM parameters of the number of defects at the end of the cascade and of the PKA penetration depth in Si and in Ge materials.

(ii) Describe how the TTM parameters act on the physics of collision cascades in two materials very distinct by their thermal properties.

All the different TTM sets of parameters tested are called "scenarios" and compared to a "reference scenario" whose parameter values rely on the experimental and theoretical values available and on our previous studies [5, 27].

The methodology for the simulation of TTM-MD collision cascades as well as the TTM model, TTM parameters of interest and their value in the reference scenario are presented in section 2. Sensitivity of the results to the TTM parameters is studied for various scenarios both in Si and Ge materials in section 3. Discussions on the physics behind the observed impacts of the parameters are presented in section 4.

2. Methods

2.1. Setting up the MD simulations

To initiate the collision cascade, the PKA is given a velocity corresponding to 10 keV and a certain direction. It shocks other atoms on its path, creating Secondary Knockon Atoms (SKAs), which displace other atoms from their equilibrium positions as well. The stochasticity of the so created cascades makes it mandatory to run a large number of simulations, each initiated by a PKA with a distinct initial direction. 100 simulations per set of parameters have been necessary to work with meaningful statistical data.

The TTM-MD simulations have been run using the LAMMPS code [28]. Boxes of 1 000 000 atoms made of $50 \times 50 \times 50$ cubic diamond unit cells are employed in most directions, but for some channelling PKAs directions, boxes of 4 096 000 atoms made of $80 \times 80 \times 80$ cubic diamond unit cells are necessary. The simulation box is divided into two areas: the outer cells (1 unit cell of width, *i.e* 5.431 Å) form an NVT ensemble in which the atomic displacements are controlled by a Langevin thermostat (damping time of 0.1 ps) to maintain the temperature at a desired value, and the inner cells form an NVE ensemble in which the atoms evolve freely to simulate the collision cascade.

The initialization of the simulation is made by scaling the velocities of all atoms, such that the overall temperature is the desired one, 100 K in the current work. The system is equilibrated during 20 ps with a timestep of 1 fs.

The maximum velocity of the atoms drastically changes between each step of the cascade: fast during the collision part, and slower during the thermal wave and recrystallization part [5]. Consequently, it is possible to decrease the precision of the integration timestep in parallel of the velocities, while maintaining a displacement lower than 0.025 Å between two steps. In the present work, running 10 keV simulations with Si and Ge on 1 ns, the typical timesteps are: 0.01 fs during 2 ps, then 0.1 fs from 2 ps to 20 ps, and finally 1 fs between 20 ps and 1 ns.

Stillinger-Weber types potentials are employed for the simulations both in Si and Ge. For Si, the SW potential employed is the one developed in [29], and for Ge the one parametrized in [30] with the slight modifications made in [2]. However, to better describe short interatomic distances and thus collisions, the SW potential must be combined to a stronger repulsive two-body potential. The repulsive potential used is the Ziegler Biersack Littmark one (ZBL) [31] for both Si and Ge. SW and ZBL potentials are combined together through a Fermi function as in [32]:

$$V_{tot}(r) = (1 - F(r))V_{ZBL}(r) + F(r)V_{SW}(r)$$
(1)

where V_{tot} is the total potential, V_{ZBL} the repulsive ZBL potential, V_{SW} the SW potential and F(r) the Fermi function used to link the two potentials. The expression of the Fermi function of Eq. 1 as well as its parameters values for Si and Ge can be found in [27].

The thermal properties of the SW potentials used for Si and Ge are not modified by the changes in the repulsive region. Thermal properties both for the Si and the Ge potential, which are of prime importance in this study, are presented and compared to experimental values in Table 1. The values are the ones reported by Lopez *et al.* in [4]. The melting temperatures show great consistency with experimental values. Simulated thermal conductivities are overestimated both for Si and Ge, but the ratio, important for discussion, between κ_{Si} and κ_{Ge} in the experimental and simulated case is conserved. Thus, despite the discrepancies between the experimental and simulated values, the qualitative observations are not jeopardized.

Table 1: Experimental (Expt.) and simulated (Simu.) values of the melting temperatures T_m and thermal conductivities κ (at 500 K) with the employed potentials for Si [29] and Ge [2, 30]. The values displayed are the ones reported in [4].

	S	Si	Ge		
	Expt.	Simu.	Expt.	Simu.	
T_m (K)	1685	1653	1211	1211	
$\kappa \; (W/cm/K)$	0.78	1.74	0.33	0.72	

2.2. The Two-Temperature model and key parameters

Based on the theoretical studies conducted on the role of electronic effects in collision cascades by Caro *et al.* [6] and Koponen [33], Duffy *et al.* proposed a way of combining the TTM to MD simulations of radiation damage [8].

It consists in coupling the ionic system to an electronic subsystem made of an homogeneous electron gas as illustrated in Fig. 1. Both the ionic system and the electronic subsystem are divided in finite element cells, that form two

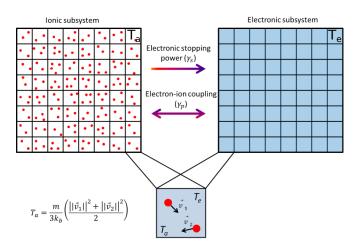


Figure 1: 2D scheme of the working principle of the Two-Temperature Model. Red dots represent atoms.

grids with the same size. In each cell, an atomic temperature T_a and an electronic temperature T_e are defined. In practice, each cell must contain enough atoms to define a statistically meaningful temperature. In our simulations, a grid of 20x20x20 corresponding to an average of 125 atoms per cell ensures that the electronic and atomic temperatures are not subject to harsh oscillations.

The finite elements cells of the ionic and electronic systems which are at the same position exchange energy through γ_s and γ_p as pictured in Fig. 1. The ions lose a part of their kinetic energy because of γ_s and γ_p . This energy is transferred to the electronic subsystem, which increases its temperature T_e . Part of the energy gained by the electronic subsystem can be fed back to the ionic system through the electron-ion coupling γ_p . The ionic equations of motion used in MD are thus completed by a friction term which removes energy, and by a stochastic force term which gives back the energy as in Eq. 2:

$$m_i \vec{a}_i = \vec{F}_i^{adiab} - \gamma_i \vec{v}_i + \vec{F}_i^{stoch} \tag{2}$$

where, m_i is the mass of the ion i, $\vec{v_i}$ is the velocity of the ion i, $\vec{a_i}$ is the acceleration of the ion i, $\vec{F_i^{adiab}}$ represents the adiabatic forces acting on the atom i deriving from the potential, γ_i is the friction coefficient, and $\vec{F_i^{stoch}}$ represents the stochastic forces acting on the atom i and depends on the electronic temperature.

The γ_i coefficient depends on the velocity of the considered ion. If the velocity of the ion *i* is below a critical velocity v_0 , then $\gamma_i = \gamma_p$, otherwise, $\gamma_i = \gamma_s + \gamma_p$. The friction coefficient γ_i can then be defined like in Eq. 3:

$$\begin{cases} \gamma_i = \gamma_p & \text{if } ||\vec{v}_i|| \le v_0\\ \gamma_i = \gamma_p + \gamma_s & \text{if } ||\vec{v}_i|| > v_0 \end{cases}$$
(3)

Moreover, it is often recommended to let the system evolve for a fraction of ps before including the electronion coupling [11] because during the early stages of the cascade, the atomic temperatures are ill-defined due to the very fast-moving atoms. We added this option in LAMMPS through the definition of a new parameter called t_{eph} .

In addition, the heat diffusion in the electronic subsystem is taken into account via the following relation:

$$C_e \frac{\partial T_e}{\partial t} = \nabla(\kappa_e \nabla T_e) - g_p (T_e - T_a) + g_s T'_a \qquad (4)$$

where, C_e is the electronic specific heat, T_e is the electronic temperature, κ_e is the electronic heat conductivity, T_a is the atomic temperature, T'_a has the dimension of a temperature and contributes to the energy balance, g_s and g_p are coefficients deriving from γ_s and γ_p respectively.

The TTM parameters we investigate in this paper are $C_e \ \gamma_s, \ \gamma_p, \ v_0$ and t_{eph} . All those parameters as well as their values or expressions for the reference scenario of the parametric study of section 3 are given respectively in paragraphs 2.2.1, 2.2.2, 2.2.3, 2.2.4 and 2.2.5.

2.2.1. Electronic specific heat (C_e)

The electronic specific heat C_e describes the amount of energy needed to increase by 1 K the temperature of the electronic system. It is electronic temperature dependent. In metals, C_e is linear at low T_e and constant and equal to the free electron gas value of $3/2k_B$ at high T_e . Simple models can be built to accurately describe the T_e dependence of C_e in the TTM for metals [8]. For semiconductors, C_e is first nearly constant and equal to zero at low T_e due to the band gap, and then start increasing. Khara et al. have calculated C_e for Si [13]: they have estimated the T_e dependence of C_e in Si with Density Functional Theory (DFT) calculations. They use a Fermi-Dirac smearing for performing finite electronic temperature calculations. The purpose of this study being to assess the influence of the C_e parameter, an approximate expression is sufficient. Thus, C_e is considered constant and equal to the free electron gas value of $3/2k_B$ above the Fermi temperature (when the conduction band is populated).

Aiming at constructing a simple model, we have modified the C_e model of Duffy *et al.* [8] to adapt it to semiconductors in a similar manner as what was done by Phillips *et al.* in [15]:

$$C_e(x) = 0.5 \times (A - \epsilon) \times (1 + tanh(B(x - x_f))) + \epsilon \quad (5)$$

where $x = T_e/1000$, $A = 3/2k_B$, and the coefficients B and x_f are fitted to reproduce the experimental measurements [24] at low temperature and the $3/2k_B$ asymptote above the Fermi temperatures. The Fermi temperatures are 6 498 K and 3 829 K for Si and Ge respectively. Due to numerical limitations, C_e cannot be set as close to zero as desired. This is the purpose of ϵ in Eq. 5 that guarantees a minimum small value for C_e ($\epsilon = 10^{-6}$ eV/K). Therefore, C_e does not match perfectly the low temperature experimental points as can be seen in Fig. 2 and is set as low as possible, without any consequences on the results.

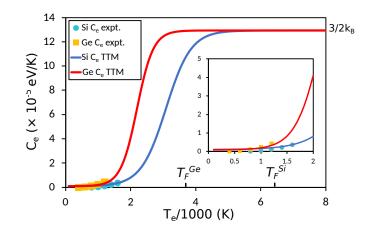


Figure 2: Variation of the electronic specific heat for Si and Ge as a function of the temperature. The Fermi temperatures, written T_F^{Si} and T_F^{Ge} , and the asymptotic value are shown. Variations at low temperatures are given in the insert.

2.2.2. Electronic stopping power (γ_s)

The electronic stopping power is a friction coefficient through which fast enough moving atoms lose energy to the electronic subsystem. It describes the excitation of the electrons due to an inelastic collision with an energetic atom. In practice, calculating the electronic stopping power of an ion moving with a certain velocity can be done with Time Dependent Density Functional Theory techniques (TD-DFT) [34]. However, the easiest way to quantify it for the TTM remains the use of SRIM tables and the Lindhard and Sharff model, as done in this study [7, 35]. For nearly 0 keV to 10 keV Si ions in Si, the calculation of γ_s with SRIM gives 39.43 g/mol/ps. For nearly 0 keV to 10 keV Ge ions in Ge it gives 31.64 g/mol/ps. The electronic stopping power has a mechanistic effect on the moving ions by making them lose energy. Therefore the moving ions deposit less energy through nuclear elastic collisions and penetrate less deep in the material. The outcomes of changes in this parameter are of prime interest (see section 3).

2.2.3. Electron-ion coupling (γ_p)

This parameter has two roles. First it is part of the friction coefficient through which the ions lose energy to the electronic subsystem. Second, it drives the amount of energy fed back to the ions from the electronic subsystem, the energy at stake being proportional to the electronion coupling.

Two assumptions are made in this study. First, the electron-ion coupling parameter is considered to be equal to the electron-phonon one obtained at low temperatures in ordered systems [8]. Second, it is considered to be constant for the entire range of temperature.

For some material, the electron-phonon coupling is determined by combining experiments and theoretical models. As noticed by Duffy [8], the range of reported values for the electron-phonon coupling parameter for a given material can be very large. For Si, two values, differing by a factor of 3, have been reported [25, 26]. For our simulations, unless said otherwise below, we have chosen the value of 24.443 g/mol/ps [25] which was optimized for SHI simulations in Si to provide the best fit with experimental data. No data were available for the electron-phonon coupling in Ge, we have therefore chosen to use the same as in Si. The values for the two materials are expected to be similar considering the common properties they share. The current hypothesis is that the real Ge value is probably slightly lower than the Si one due to the enhanced size of thermal spikes in Ge compared to Si ones which could make it harder for Ge to support phonons [8].

2.2.4. Velocity threshold for the electronic stopping power (v_0)

The electronic stopping power is in the theory described as acting on ions whose velocity is not too small [36]. At low energies, only the electron-phonon coupling acts on the ions [37]. The v_0 parameter idea is to incorporate this fact into the TTM model. The choice of a correct value or rule to follow for v_0 is still debated: Zarkadoula *et al.* [18] and Jay *et al.* [5] used a threshold corresponding to twice the cohesive energy of the material whereas Björkas *et al.* [38] employed a threshold velocity corresponding to the cohesive energy and Nordlund *et al.* [39] chose the value of 10 eV. In order to be coherent with our previous studies [5, 27], we choose to set v_0 to twice the cohesive energy of the system. Thus, v_0 is set to 79.76 Å/ps (*i.e.* a cohesive energy of 4.63 eV [40]) in Si and 45.20 Å/ps (*i.e.* a cohesive energy of 3.85 eV [40]) in Ge.

2.2.5. Electron-phonon activation time (t_{eph})

It is recommended to turn on the electron-phonon coupling only after a certain amount of time [11]. Indeed, in the early stages of a cascade, the atomic temperatures T_a calculated by the MD code are artificially high due to the presence of very fast moving atoms. Thus, the energy exchanges between the electronic and ionic subsystems are biased at the beginning of the cascade. This issue can be overcome by delaying the electron-phonon energy exchanges. We added this option in LAMMPS, thus defining a new parameter called t_{eph} . The electron-phonon coupling γ_p is then:

$$\begin{cases} \gamma_p = 0 & t \le t_{eph} \\ \gamma_p = 24.443 \text{ g/mol/ps} & t > t_{eph} \end{cases}$$
(6)

3. Results

To investigate the effects of the TTM parameters, 100 simulations are performed for each TTM parameterization. For a better understanding, each case is given a "scenario" name:

- The **Reference (Ref)** scenario refers to a case where the default γ settings defined in section 2 are employed ($\gamma_p = 24.443$ g/mol/ps, $\gamma_s = 39.43$ g/mol/ps for Si and $\gamma_s = 31.64$ g/mol/ps for Ge) with a C_e varying as shown in Fig. 2. The threshold v_0 is set to 79.76 Å/ps for Si and 45.20 Å/ps for Ge (*i.e.* the velocity corresponding to twice the cohesive energy of each material). This scenario is considered to be the baseline scenario to which all the others are compared.
- The electronic friction (ElFr) scenario corresponds to a Ref scenario where γ_s is set to 100 g/mol/ps.
- The electron-phonon (EL-PH) scenario corresponds to a Ref scenario where γ_p is set to 100 g/mol/ps.
- The **High** C_e scenario corresponds to a Ref scenario where C_e is set constant and equal to the high T asymptotic value of $3/2k_B$.
- The Low C_e scenario corresponds to a Ref scenario where C_e is set constant and equal to a low value of 10^{-6} eV/K.
- The **Low v**₀ scenario corresponds to a Reference scenario where v_0 is set to the velocity corresponding to once the cohesive energy, *i.e.* 56.39 Å/ps for Si and 32.12 Å/ps for Ge.
- The phonon (PH) keyword might be written next to the Ref (*i.e.* Ref (PH)), Low C_e and High C_e scenario names. It means the t_{eph} parameter is switched on to the value of 0.25 ps.

To rightfully compare the electron-phonon and electronic friction scenarios, the sum γ_i of γ_s and γ_p is kept constant between the two scenarios. Thus, when γ_p is equal to 100 g/mol/ps, γ_s is set to the default value of γ_p equal to 24.443 g/mol/ps. Therefore, $\gamma_i = \gamma_s + \gamma_p$ is always equal to 124.443 g/mol/ps for the ElFr and EL-PH scenarios, for both Si and Ge materials. For the Ref, Ref (PH), ElFr and EL-PH scenarios, the properties investigated in the cascade are the PKA penetration depth, the number of defects at the end of the cascade and the maximum electronic temperature. For the High C_e , High C_e (PH), Low C_e , Low C_e (PH) and Low v_0 scenarios, the number of defects at the end of the cascades and the maximum electronic temperature are investigated. Indeed, it was not judged relevant to compare the PKA depth observed in those scenarios because C_e and v_0 have no friction effect on the moving ions. A large variety of methods to count defects have been compared by Nordlund *et al.* in [2]. It was found that all the methods scale really well one with each other. In this study, the Lindemann criterion technique is used [41]. This method and parameters values for Si and Ge are described in [27]. At each timestep of a MD simulation the number of interstitials and vacancies are equal. Thus, the number of defects is taken as the number

of vacancies (or interstitials), not the sum of the two. The mean values of all those parameters for each simulation scenario are displayed in Table 2.

3.1. Production of damage and PKA penetration depth in the ElFr and EL-PH scenarios

In this section, the results of the ElFr and EL-PH scenarios are compared to the Ref one in order to evaluate the impact of γ_s and γ_p .

The mean numbers of defects observed at the end of the simulations are given in Table 2, and their distributions in Fig. 3(a) and Fig. 3(b). According to Table 2, this number in Si (resp. in Ge) decreases from 622 (resp. 2361) for the Ref case, to 416 (resp. 1569) in the electronic friction scenario and 410 (resp. 1338) in the electron-phonon scenario. In the same way, Fig. 3(a) and Fig. 3(b) exhibit a drastic decrease of the number of defects when each of the two γ parameters increase. This implies that the γ parameters play a fundamental role in the reduction of the number of final defects. However, while γ_s and γ_p seem to have the same influence on the reduction of the number of defects in Si (416 \approx 410), this reduction is enhanced in the electron-phonon scenario in Ge (1569 > 1338).

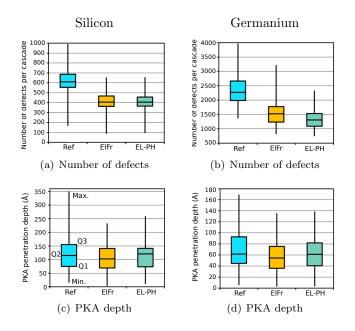


Figure 3: Box plots of the number of defects at the end of the simulations for the Ref and γ scenarios in Si (a) and Ge (b). Box plots of the PKA penetration depths for the Ref and γ scenarios in Si (c) and Ge (d). The lowest horizontal black bars correspond to the first quartile values (Q1), the middle ones to the median values (Q2) and the third ones to the third quartiles values (Q3). The two black vertical bars below and above each box represent the minimum (Min.) and maximum (Max.) values of the datasets. These box plots are constructed from 100 simulations per scenario.

The mean penetration depth of the PKAs is given in Table 2, and their distributions in Fig. 3(c) and Fig. 3(d). There are no clear downward shift neither in the PKA depths distributions of Fig. 3(c) and Fig. 3(d) nor in the

mean PKA depth values of Table 2. The maximum difference between all the mean PKA depths of Table 2 is less than 15 Å both for Si and Ge. It is thus difficult to identify a global behavior in this case.

Hence, both γ parameters do not seem to play a major role in the size of the cascade at the energy of interest (10 keV). The only doubtlessly observable change is the reduction in the maximum PKA depth when moving to the electronic stopping and electron-phonon scenarios. The reason is that the maximum PKA penetration depths are observed when the PKA is in a channeling direction where very small amount of energy is lost through shocks. In these specific directions, the PKA is then more subject to the influence of the TTM. Even if no trends can be identified with 10 keV ions, the γ parameters are expected to have an important role in the penetration depth at higher energies.

3.2. Damage production in the Ref, Low C_e and High C_e scenarios

The mean number of defects that were obtained with the Ref, Low and High C_e scenarios are given in Table 2 and the associated distributions are displayed in Fig. 4(a)for Si and Fig. 4(b) for Ge. There is a clear downward shift of the entire defect distributions in Fig. 4(a) and Fig. 4(b) from the Low C_e to Ref scenarios for Si and Ge. In Ge, the number of defects decreases again from the Ref to the High C_e scenario. On the contrary in Si, no difference is visible between the Ref and High C_e scenarios. Following Table 2, in Si (resp. Ge), the mean number of defects decreases from 699 (resp. 2625) in the Low C_e scenario to 618 (resp. 2191) in the High C_e scenario. The mean number of defects calculated in the Ref scenario lies exactly between the two extreme scenarios for Ge whereas it lies at the same level as the High C_e scenario in Si. The effects of C_e are therefore more important in Ge than in Si.

3.3. Influence of v_0 on the number of defects

The impact of a change in v_0 between the two most recommended rules (*i.e.* one time the cohesive energy [5, 18] for the Low v_0 scenario or two times the cohesive energy [38] for the Ref scenario) to set it is investigated. The mean number of defects that were obtained with the Reference and Low v_0 scenarios are displayed in Table 2. In Si, there is only a discrepancy of 2 defects between the Ref (622) and Low v_0 (624) scenarios whereas the SEM is of 13 in each scenario. In Ge, the discrepancy is of 11 defects (2361 for the Ref scenario and 2372 for the Low v_0 scenario) but the SEM is of 58 in each case. Thus, there is not any difference between the Ref and the Low v_0 scenarios at the considered energies of 10 keV.

3.4. Influence of t_{eph} on the number of defects

The effect that t_{eph} has on the previously observed trends is investigated here. Table 2 gives the mean values of the number of defects for the C_e scenarios with and

Table 2: Mean values of the PKA depth, of the number of defects at the end of the cascade and of the maximum electronic temperature. Average obtained over 100 simulations for all the scenarios considered. In parenthesis are given the standard errors of the mean. E_{coh} corresponds to the cohesive energy and m to the mass.

		C_e as in Fig. 2		High γ_s High γ_p		$C_e \approx 0$		$C_e = 3/2k_B$		$v_0 = \sqrt{2 \times E_{coh}/m}$	
	El-ph coupling	Always	After 0.25 ps	Always	Always	Always	After 0.25 ps	Always	After 0.25 ps	Always	
	Scenario name	Ref	Ref (PH)	ElFr	EL-PH	Low C_e	Low C_e (PH)	High C_e	High C_e (PH)	Low v_0	
	PKA depth (Å)	120(7)		107(5)	114(5)						
Si	Defects	622(13)	620(11)	416(9)	410(8)	699(14)	676(14)	618(12)	614(9)	624(13)	
	$Max T_e$ (K)	7439	7525	11619	11152	121548	150594	4905	4812	7477	
	PKA depth (Å)	70(5)		59(3)	62(3)						
Ge	Defects	2361(58)	2396(61)	1569(44)	1338(33)	2625 (63)	2643(61)	2191(53)	2075(49)	2372(58)	
	Max T_e (K)	3875	3691	5584	5932	78121	83638	1768	1777	3690	

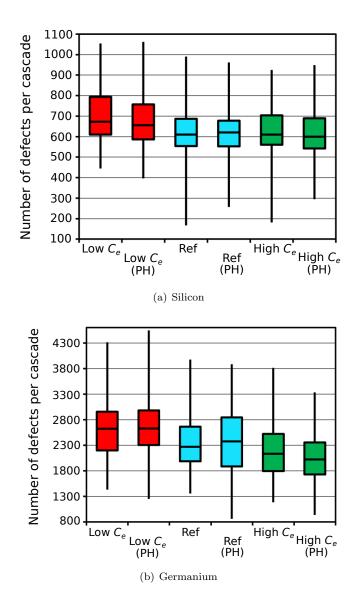


Figure 4: Box plots of the number of defects in Si and Ge at the end of the MD simulations for different C_e scenarios. Results are provided based on 100 simulations per scenario.

without t_{eph} and Fig. 4(a) and Fig. 4(b) the global distributions. According to Table 2 the differences in the mean values of defects between the C_e scenarios with or without

 t_{eph} are at most 25 defects in Si. In Ge, the differences are less than 50 defects for the Ref and Low C_e scenarios whereas it is a bit higher, 120 defects, for the High C_e scenario. Considering the global distributions of Fig. 4(a) in Si for the same C_e scenarios with or without t_{eph} , the differences are too small to identify a trend. In Ge, no difference is visible with or without t_{eph} in the global distributions of Fig. 4(b) except for the High C_e (phonon) scenario which seems to have undergone a slight decrease compared to the High C_e (without t_{eph}) scenario. On the whole, the hierarchy between the C_e scenarios in terms of number of defects is unchanged and the differences observed with the use of t_{eph} are so small that t_{eph} does not seem to play any role.

4. Discussions

Three main experimental trends are confirmed by the TTM-MD simulations:

- Experimental studies show that a lot more defects are observed in Ge than in Si [20, 21]. Those trends are confirmed by our own simulations in which in the Ref scenario there are in average about 300% more defects in Ge (Fig. 3(b)) than in Si (Fig. 3(a)).
- Experiments have shown that the penetration depth of various ions is higher in Si than in Ge [42]. Our simulations confirm that self PKAs penetrate always deeper in Si (Fig. 3(c)) than in Ge (Fig. 3(d)).
- It was also shown experimentally that amorphous regions are preferentially formed in Si-Ge alloys and in pure Ge than in pure Si [21]. Our simulations tend to confirm this phenomenon. In Table 3 is displayed the distribution of the defects inside the clusters depending on the cluster sizes for both Si and Ge in the Ref scenarios. It is found that there are less clusters of defects in Ge (mean value of 21 in Ge compared to 34 in Si) and that the vast majority of defects in Ge are contained within very large amorphous pockets of defects. On the contrary, in Si, the clusters formed are of much smaller size which indicates they are not part of large amorphous pockets.

Table 3: Average number of clusters created by a 10 keV PKA at the end of 100 TTM-MD simulations in Si and Ge materials for Ref scenario, and the distribution of the defects inside these clusters as a function of their size.

	Si	Ge
Mean number of clusters	34	21
% of defects in clusters of size ≤ 5	11%	3%
% of defects in clusters of size > 5 and ≤ 100	57%	5%
% of defects in clusters of size > 100 and \leq 1000	32%	15%
% of defects in clusters of size >1000	0%	77%

Heat spikes, or thermal spikes image the local melting of a material under the effect of elastic and inelastic interactions between an incoming energetic particle and the atoms of the target material. The hot liquid zones which are formed during a thermal spike may form amorphous regions when they cool down. MD simulations have helped understanding that the heat spike mechanism is the leading mechanism in the formation of large amorphous pockets in Ge. On the contrary, in Si, even if some heat spikes can lead to amorphous pockets, a much larger portion of small clusters remains [2, 4, 43]. The lower melting point of Ge compared to Si as well as its lower thermal conductivity, which makes the dissipation of heat slower, were cited as the two main reasons for the enhanced melting of Ge in response to particle irradiation [4]. The melting point and the thermal conductivity are both determined by the interatomic potential. Therefore, the fine tuning of the thermal properties of the interatomic potential is of prime importance.

4.1. Si versus Ge: different mechanisms in response to particle irradiation

To finely understand the effects of the TTM in Si and Ge, we plotted in Fig. 5 the average evolution of the number of TTM ionic cells that have an atomic temperature higher than the melting temperature of the material (melting temperature of 1687 K for Si and 1211 K for Ge) over 100 simulated cascades. Very quickly, the curves reach their peak value (collision phase), then, rapidly decrease for a very short time before continuing to slowly decrease. The fact that a cell has a temperature higher than the melting one does not mean it is melted. To be melted, cells must necessary have a temperature higher than the melting point, for a sufficient amount of time. In the following, we refer to hot cells as the ones having a temperature higher than the melting temperature. The number of hot cells combined with the time for the relaxation of the hot cells are relevant indicators of the presence of molten regions in the material.

We observe a clear difference in Fig. 5(a) and Fig. 5(b) between Si and Ge: the number of hot cells is always higher in Ge and the relaxation time required for the number of hot cells to reach zero is longer.

However, as explained in the use of t_{eph} (see paragraph 2.2), during the early stages of a cascade the calculated

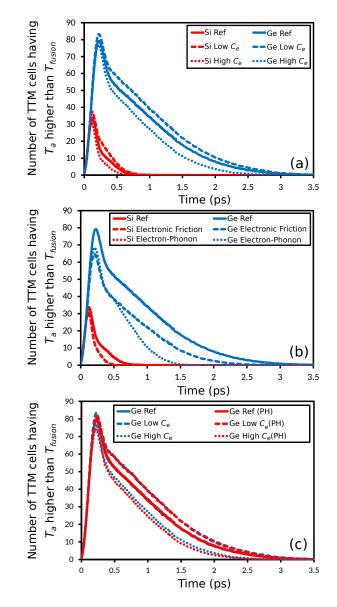


Figure 5: Evolution of the number of TTM cells having a temperature higher than the melting temperature (a) in Si and Ge for the three different C_e scenarios (b) in Si and Ge for all the γ parameters scenarios (c) in Ge for the C_e scenarios with and without the t_{eph} option. Each curve is the result of an average over 100 simulations.

temperature does not represent an accurate evaluation of the temperature of the cell. In fact, the temperature is an average over a high number of atomic velocities, whereas the early stages of the cascade only involve the displacement of a small number of SKA. Thus, one may ask if the number of melted cells is not biased during the collision part. Generally, after $t_{eph} \sim 0.25$ ps, the collision part of the cascade is over and the fast-moving atoms have lost all their energy through shocks. This implies that about all the atoms in a same cell have the same averaged velocity and that a temperature can be well defined in this cell. Thus, only after t_{eph} , Fig. 5 really shows the number of hot cells inside the materials.

The larger peak values and relaxation times for Ge sce-

narios in Fig. 5(a) and Fig. 5(b) explain why steady amorphous pockets (hot cells becoming molten cells) are preferentially formed in Ge and not in Si. According to the mean PKA penetration depth of Si and Ge (Table 2), Ge PKAs deposit their energy in smaller regions and therefore create denser cascades and melted zones. This together with the lower thermal conductivity of Ge compared to Si (Table1) could explain the long relaxation time needed for the hot cells to lower their energy. Hence, it confirms that melting of the material is indeed far more important in Ge than in Si.

However, it is impossible to state yet that melting can partially be the result of the TTM and the electron-phonon coupling.

4.2. C_e scenarios reveal electron-phonon coupling participates to melting within the TTM

The hot cells are defined after the collision phase when the velocities are below v_0 . In this case, the energy exchanges ΔU between the ionic subsystem and the electronic subsystem at each timestep is [8]:

$$\Delta U = \frac{\Delta t N 3 k_b \gamma_p}{m} (T_e - T_a) \tag{7}$$

where N is the number of atoms in the cell, k_b is the Boltzmann constant, Δt is the MD timestep, m is the mass of an atom, T_e is the electronic temperature and T_a the atomic temperature.

Thus, the more T_e is higher than T_a the more the energy transfer is in favor of the ionic subsystem. Moreover, in Table 2, the maximum electronic temperatures increase with C_e decreasing. Hence, according to Eq. 7 the amount of energy gained by the ionic subsystem increases with C_e decreasing. It is also observed in Fig. 5(a) that for both Si and Ge, the number of hot cells is higher for the scenarios with a lower C_e . However, C_e does not have any effects in the rate of energy loss of the moving ions: the only mean by which a change in C_e can induce a change in the number of hot cells is from the energy transfer from the electrons to the ions through electron-phonon coupling. The evolution of the number of hot cells in Fig. 5(a) is linked to the evolution of the mean number of defects in Table 2. It confirms our hypothesis that, in the TTM, the electron-phonon coupling is sufficient to induce partial melting of the material. The effects of C_e are more visible in Ge than they are in Si because the formation of thermal spikes preferentially occurs due to interatomic potential related properties: a lower melting temperature and a lower thermal conductivity compared to Si.

One may ask if noticeable discrepancies would be observed if a DFT calculated C_e was used (like in the work of Khara *et al.* [13]) instead of the C_e of the Ref scenario. The differences between the C_e parameters in the Low C_e , High C_e and Ref scenarios being much more significant than what would be the differences between a DFT calculated C_e and the C_e of the Ref scenario, the hypothetical observed discrepancies would be small. Also, we have seen in section 3 that the number of defects is more sensitive to changes in C_e in Ge than it is in Si. Thus, we expect no change for Si and only a slight change for Ge.

4.3. Competition between γ_p thermal and mechanistic effects

We have discussed how the C_e scenarios reveal that melting is possible by energy transfer through γ_p . However, the role of γ_p is dual: on the one hand, increasing γ_p increases the energy transfer from the electrons to the ions but on the other hand, increasing γ_p increases the energy loss of the moving atoms by electronic friction. Thus, there is a competition between the mechanistic effects that reduce the number of defects, and the thermal effects that increase the number of defects. The drastic reduction in the number of defects observed in Table 2 when increasing γ_p (EL-PH scenario) reveals that the mechanistic effects are dominating over the thermal effects.

4.4. γ_p enhanced effect in Ge due to the presence of large thermal spikes

For Si, the mean numbers of defects that appear in Table 2 and the global distributions shown in Fig. 3(a) reveal that the reduction of the number of defects in the EL-PH and ElFr scenarios is very similar. This is correlated with the number of hot cells presented in Fig. 5(b): in the case of Si, the curves of the two γ parameters scenarios overlap perfectly. This means that the two γ parameters contribute equally to the melting of the material.

On the contrary, for Ge, the mean values of Table 2 and the global distributions of Fig. 3(d) reveal that the reduction of the number of defects is enhanced in the EL-PH scenario compared to the ElFr one. This is correlated with the number of hot cells presented in Fig. 5(b): the electron-phonon and electronic friction curves have about the same peak value but the decrease in the electronphonon curve case is sharper and the curve quickly goes below the electronic-friction one. This means that in the TTM, γ_p reduces more the melting in Ge than γ_s does and consequently induces a lower number of defects.

The only difference between γ_p and γ_s in the way they contribute to the ionic subsystem energy loss is that γ_p is always activated whereas γ_s is not activated when the velocity of the atom is smaller than v_0 . If this difference induces no remarkable effects in Si, it does in Ge. In fact, in Ge, the vast majority of defects is produced in liquid-like regions cooling down to become amorphous pockets, and the atoms in these regions have a velocity lower than v_0 . In this case, the γ_p parameter permanently acts to reduce the energies of the atoms in those amorphous pockets and γ_s does not. Therefore, the sizes of the liquid-like zones shrink quicker in the EL-PH scenario compared to the ElFr scenario. Consequently, less and smaller amorphous pockets are formed and fewer defects are obtained.

The fact that there are more liquid-like regions in Ge than in Si is mainly due to two of their basic properties defined by the interatomic potential. First, the size of the Ge atom is bigger than the Si one. Consequently, the Ge PKAs and SKAs deposit their energies quickly and in smaller regions, inducing a localised melting. Second, the melting temperature of Ge is much lower than the one of Si. Consequently, a PKA with the same energy leads to obtain more melted cells in Ge than in Si. The effects of the TTM is then drastically correlated to the interatomic potential.

4.5. v_0 has no influence

The v_0 scenarios considered show no change in the mean number of defects at the end of the cascade. At the considered energies of 10 keV, the setting of v_0 to either one time the cohesive energy or two times the cohesive energy (*i.e.* the rules the most employed) has no influence. However, it can be expected that it has an influence at higher PKA energies.

$4.6. t_{eph}$ has no influence

The use of t_{eph} induces no changes in the global trends for the C_e and γ scenarios, at the considered energy of 10 keV. It is confirmed by Fig. 5(c) which shows the evolution of the number of TTM cells having their temperature greater than the fusion temperature. The parameter t_{eph} is however expected to influence the results in simulations where the electronic temperatures attained are greater (due to higher PKA energies for example). We still recommend to use it even in 10 keV simulations in order to overcome the bias induced by the badly defined ionic temperature at the beginning of the cascade.

5. Conclusion

An extensive statistical study aiming at assessing the impact of the main TTM parameters and truly understanding their physical role within the TTM is performed. Due to the stochasticity of the cascades, carrying out a high number of simulations is of prime importance to analyse global trends of their impact. The data presented in this article are the results of more than 2 000 TTM-MD collision cascades simulations initiated with 10 keV PKAs. The comparisons between simulations with various TTM parameter values allows us to draw five main conclusions:

(i) The electronic stopping parameter and the electronphonon coupling parameter have the larger impact on the production of defects.

(*ii*) The influences of the electron-phonon coupling parameter and of the electronic specific heat on the number of defects are greater for materials more subject to thermal spikes.

(iii) Changes in the threshold velocity for the electronic stopping power between the two most recommended rules to set it induces no difference in the mean number of defects.

(iv) The use of a parameter to set the time of activation of the electron-phonon coupling implies no change in the trends, at the considered energies.

(v) The electron-phonon coupling contributes to increase the number of defects in materials for which the irradiation leads to molten regions.

These conclusions depend on the size of the PKA and on the melting temperature of the material under investigation, which are crucial to predict the appearance of molten regions and thus the influence of the TTM. Our work is giving very valuable quantitative data for the TTM users, as well as precious qualitative data on the role the electrons have in a collision cascade simulated with MD-TTM depending on the material under investigation and therefore the cascade behaviors at stake.

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