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# Nanoindentation/scratching at finite temperatures: Insights from atomistic-based modeling



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# ABSTRACT

Atomistic-based multiscale and molecular dynamics modeling are powerful tools to simulate the localized strain problems, offering tremendous opportunities to bridge the knowledge gaps in quantifying and understanding the linkage of plasticity mechanisms and nanomechanical/tribological response of materials at finite temperatures. In this article, we give an overview of these atomistic-based modeling techniques which are amenable to the nanoindentation/scratching at finite temperatures, and briefly describe the pertaining physics, e.g., long range dislocation motion and heat transfer, during nanoindentation/scratching at finite temperatures. We summarize the effects of temperature, loading rate, and crystallographic planes on the process of defect formation and migration as well as the nanomechanical/tribological response of a wide range of crystalline and amorphous materials subject to nanoindentation/scratching, Our review presents unresolved issues and outstanding challenges in atomistic-based modeling of nanoindentation/scratching at finite temperatures and sheds light on the path forward in this emerging research area.

# 1. Introduction

Indentation is one of the main techniques for probing mechanical properties of engineering materials. Compared with the tension/ compression tests, an indentation test is ultra-local and less invasive, in which the indenter is pushed into the surface of the sample. Distinguished by the indentation load *L* and the penetration *h*, microindentation tests are characterized by 200 mN < L < 2 N and  $h > 0.2 \mu$ m, whereas in nanoindentation *L* ranges between a few  $\mu$ N and about 200 mN, while *h* varies from a few nm to about a few  $\mu$ m. Consequently, the indented area in nanoindentation is usually on the nm or a few  $\mu$ m scale [1,2]. Another useful technique which can provide extensive insight into the nanoscale mechanical response and plastic deformation of materials is nanoscratching. Unlike nanoindentation, the process of nanoscratching is deviatoric stress-dominative and usually carries a pronounced component of shear, leading to initiation of plasticity mechanisms which may be different from those in nanoindentation [3]. Moreover, while nanoindentation can be used to measure the material hardness, nanoscratching can be employed to evaluate the nanotribological behaviour, frictional, and wear properties of lightly loaded nanostructures, e.g., thin films and hard coatings utilized in micro/ nanoelectromechanical systems (MEMS/NEMS) and other industrial applications [4–6]. As all mechanical and nanotribological properties of materials are temperature-dependent, primarily owing to the increased phonon activities, thermal fluctuation, and phase transformation, small-scale characterization of materials using nanoindentation/scratching at finite temperatures would open up substantial new possibilities in nanomechanics to understand material behaviour at service temperatures and conditions relevant

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Nomenclature		GB	grain boundary
		GIMP	generalized interpolation material point
3C-SiC	cubic silicon carbide	GSFE	generalized stacking fault energy
ABOP	analytical bond order potential	GULP	General Utility Lattice Program
AFEM	atomic-based finite element method	HPPT	high pressure phase transformation
Al	aluminium	ISE	indentation size effect
Au	gold	L- $C$	Lomer-Cottrell
BCC	body-centered cubic	MC	Monte Carlo
BCM	bridging cell method	MD	molecular dynamics
BMG	bulk metallic glass	MEMS/N	EMS micro/nanoelectromechanical system
BMHFT	Born-Mayer-Huggins-Fumi-Tosi	MM	molecular mechanics
CAC	concurrent atomistic-continuum	MMM	multiresolution molecular mechanics
CADD	coupled atomistic/discrete-dislocation	$MoS_2$	molybdenum disulphide
cBN	cubic boron nitride	MPM	material point method
CLS	coupling of length scales	MS	molecular statics
CNT	carbon nanotube	Ni	nickel
CPFEM	crystal plasticity finite element method	P-h	load-displacement
Cr	chromium	POSMat	Potential Optimization Software for Materials
CrN	chromium nitride	QC	quasicontinuum
CTB	coherent twin boundary	REBO	reactive empirical bond order
Си	copper	RKPM	reproducing kernel particle method
DAKOTA	Design and Analysis Kit for Optimization and	Si	silicon
	Terascale Applications	STZ	shear transformation zone
DD	dislocation dynamics	SW	Stillinger-Weber
DDD	discrete dislocation dynamics	TB-SMA	tight-binding-second-moment approximation
DMD	diffusive molecular dynamics	TCB	temperature-related Cauchy-Born
EAM	embedded-atom method	$T_{g}$	glass transition temperature
EFGM	element-free Galerkin method	$T_M$	melting temperature
FCC	face-centered cubic	XRD	X-ray diffraction
FE	finite element	Zr	zirconium

to industrial applications [2,3]. Material characterization at finite temperatures also provides the opportunity to examine the kinetic aspects of fundamental physics in new materials in new ways.

Experimental studies of nanoindentation/scratching, apart from being expensive, have the restriction of direct observation of atomic-level events occurring inside the 3D materials on-the-fly within short timespans, i.e., at ps and ns time scales, which are especially important at elevated temperatures. Computational techniques become therefore necessary to capture the essential processes/phenomena during nanoindentation/scratching, most of which are at nm scales where the continuum assumption is known to break down [7]. Take the dislocation modeling in crystalline materials as an example; continuum-based modeling methods like crystal plasticity finite element method (CPFEM) and discrete dislocation dynamics (DDD) are unable to reveal atomistic details such as dislocation core structure and point defect formation/migration which are crucial for understanding physical phenomena, e.g., stacking fault formation, inherent inhomogeneity of plastic deformation/scratching. For these reasons, atomistic simulation methods, such as molecular dynamics (MD), are preferred to understand the deformation mechanisms of materials subjected to nanoindentation/scratching loading.

On the one hand, the nanoindentation/scratching process is highly localized and inherently multiscale, for that (i) the interesting physics is concentrated within a small spatial region, i.e. the localized zone and (ii) outside the localized zone, the material behaviour can be approximated by linear elasticity theory [8,9]. On the other hand, the time and length scales which can be explored by atomistic simulations are regrettably restricted by computational power. Therefore, atomistic-based multiscale modeling methods are well suited to explore nanoscale properties and behaviour of materials in the localized zone while concurrently simulating far fields using sufficiently large models during the nanoindentation/scratching process.

Some recent review papers [10,11] have discussed the current state of the art findings and challenges in room (or lower) temperature atomistic and zero temperature multiscale modeling of nanoindentation, yet, despite its importance, there is no focused review on the emerging area of high temperature nanoindentation/scratching. We are thus motivated to review recent research progresses and challenges regarding atomistic simulations of nanoindentation/scratching at high temperatures (> 300 K) as well as atomistic-based multiscale modeling of nanoindentation/scratching at finite temperatures (> 0 K). Pertinent findings on nanotribology at finite temperatures are also highlighted in this article. Future research avenues for atomistic and atomistic-based multiscale modeling of nanoindentation/scratching at finite temperatures, are also outlined. We emphasize that this review focuses on atomic-level finite temperature nanoindentation/scratching, hence it will not involve molecular statics (MS), which is a zero temperature modeling technique, or DDD and CPFEM, which are continuum-based.

## 2. Atomistic modeling

As an alternative to electronic-structure calculations [12], atomic-level simulation is considered as a powerful tool for studying the microstructure evolution of materials. Atomistic simulation methods utilize discrete atomic coordinates as (one of) the indispensable components in simulating material behaviour [13]. There exist several discrete-atom based methods [14–18], including, but not limited to Monte Carlo (MC), MD, and MS. For dynamic problems, kinetic MC and MD are considered as two main families of atomistic simulation techniques. Compared with the kinetic MC method, which probes the configuration space by trial moves of particles, MD integrates Hamilton's equations of motion to move particles to new positions and to let particles obtain new velocities. The MD method is advantageous to MC in that both the configuration space and the phase space are probed, yielding essential information about the dynamical properties of the system. Moreover, the calculation of heat capacity, compressibility, and interfacial properties can be carried out efficiently and accurately in MD simulations [19,20]. Thus, MD is considered as a main practical application of the classical particle dynamics which can be used as an apt bottom-up modeling technique to examine atomic-level events in nanoscale contact problems, e.g., nanoindentation/scratching. MD simulation of nanoindentation/scratching was pioneered by Landman et al. [21] and Hoover et al. [22] in the early 1990s. Thenceforward, many researchers have considerably contributed to this field and set a foundation for the MD study of the nanoindentation/scratching process.

It is worth noting that one of the main bottlenecks of the classical MD is its short time step, which is typically on the fs scale, arising from the high frequency oscillation of atoms. As a result, a classical MD simulation would take an enormous amount of computation time to adequately capture rare events such as diffusion and dislocation cross-slip. This has motivated the development of various approaches to prevail over the time scale constraints of MD, e.g., the diffusive molecular dynamics (DMD) [23] models that couples diffusional-displacive processes using continuous Gaussian functions to represent atomic density fields [24], and hyperdynamics [25] which uses a modified potential energy function for decreasing energy barriers and speeding up the escape from the metastable states without changing the features of the original dynamics. Particularly, DMD [23] and hyperdynamics-based multi-scale modeling methods [26,27] have been applied to high temperature nanoindentation, as will be discussed in Section 5. Interested readers are referred to a recent review by Gerberich and co-workers [28] to comprehend the basics and limitations of these methods.

#### 3. Atomistic-based multiscale modeling

As mentioned earlier, classical continuum theories are not appropriate for describing the nanoindentation/scratching process during which the plastic deformation under the indenter involves defect structures, generating a population too small to justify the continuum assumption. In the meantime, atomistic simulations are limited to relatively small spatial scales. As such, atomistic-based multiscale methodologies, which employ at least one atomistic region, offer a novel approach to cope with these problems by benefiting from the best of both atomistic and continuum techniques, enabling modeling problems that cannot be adequately explored using a full atomistic or continuum model. Nevertheless, merging a non-local atomistic model and a usually local continuum model is not trivial [29,30] and there exist outstanding challenges in avoiding aphysical consequences which may arise from (i) imperfect bonding at the atom-continuum interface, (ii) phonon dynamics and heat transfer at solid-continuum boundaries and (iii) reconstructing atomic positions from a continuum [31]. In terms of materials, some multiscale modeling techniques can only simulate single crystals, in which atomic positions are easily constructed from a continuum, compared with materials with more complex microstructures such as polycrystals. This requirement in constructing atoms from a continuum also implies that most multiscale models cannot be employed to study materials at very high temperatures, where crystalline materials may melt and/or become amorphous [32]. A number of reviews [8,9,33–39] have appeared in recent years which reflect the technical issues of the multiscale modeling methods. Interested readers are referred to these reviews to extend their knowledge in this filed.

While almost all concurrent multiscale models have the capability to handle zero temperature condition, and much success has been achieved in the field of zero temperature multiscale modeling of nanoindentation [40–63], only some of them have dynamic finite temperature formulations. In dynamic setting, because of the large characteristic element size in the continuum region, phonon propagation from the atomic region may not be fully transmitted into the continuum region and may be reflected back. Such spurious phonon reflection gives rise to the temperature gradient and seriously interferes with the dynamical equilibrium in the entirely coupled model. Particularly, in nanoindentation/scratching, the spurious wave reflection transpires severely, meaning that a large part of the energy imparted by the indenter would be artificially trapped in the atomistic domain, heating it, and destroying the accuracy of the results.

Another major issue in multiscale modeling of nanoindentation/scratching is the long range motion of dislocations, and particularly, the accommodation of dislocations in the continuum and migration of dislocations across the atomistic/continuum domain interface, which are not enabled in most concurrent multiscale methods [64]. Until now, there are only a few concurrent multiscale methods, e.g., the coupled atomistic/discrete-dislocation (CADD) method [65] and the concurrent atomistic-continuum (CAC) method<sup>1</sup> [66–68], which can describe inelastic deformation or plastic flow via the explicit motion of dislocation defects in the continuum region at finite temperatures. Thus, there is a scarcity of literature on the robust dynamic multiscale models which can be employed for nanoindentation/scratching at finite temperatures. More importantly, one should keep in mind that although a modicum of advances have been recorded in the literature with regard to the dynamic multiscale modeling formulations, most models are capable of performing dynamic simulations only at relatively low temperatures plausibly due to the wave reflections and

<sup>&</sup>lt;sup>1</sup> http://www.pycac.org/.

thermostats challenges at higher temperatures. In the following, we introduce some multiscale modeling approaches which are of practical relevance and have been adopted to simulate the nanoindentation/scratching process at finite temperatures. We emphasize that most dynamic finite temperature multiscale modeling techniques are still at the stage of method development/validation and have not been used to shed light on new physics of materials [69].

## 3.1. Atomic-based finite element method (AFEM)

In an AFEM multiscale model of nanoindentation, the substrate is divided into the atomistic, continuum, handshake (linking) regions, and filter layers [70]. A temperature control is imposed in the atomic domain to dissipate heat while the low-pass filter technique is carried out adjoining the handshaking region. In this way, the dynamical behaviour in terms of the nodal and atomic displacement distribution is achieved and spurious wave reflection at the domain interface is reduced. The AFEM method has been employed to carry out nanoindentation simulations [71].

#### 3.2. Bridging cell method (BCM)

The BCM method decomposes the model into three regions, continuum, bridging, and atomistic domains, and couples them using a finite element (FE) framework [72–75]. A combined FE-molecular mechanics (MM) simulation is employed to discretize the system into atom/nodal centric elements based on the atomic scale FE method [76,77]. To account for temperature effects, a temperature-dependent interatomic potential, e.g., the one developed by Subramaniyan and Sun [78], can be incorporated. The coupling of the atomistic and continuum domains is realized using the bridging cells, which contain locally formulated atoms whose displacements are mapped to the nodes of the bridging cell elements. BCM has indeed been used for nanoindentation studies [79].

# 3.3. Concurrent atomistic-continuum (CAC)

The development of the CAC method was motivated by the fact that most concurrent domain decomposition methods do not permit an atomistic-based description of dislocations in the continuum regions, nor do they allow smooth movement of dislocations between the atomistic and continuum regions [80]. In CAC, discontinuous FEs with faces on the slip planes of the lattice, e.g., {1 1 1} planes in face-centered cubic (FCC) and {1 1 0} planes in body-centered cubic (BCC) lattices, are employed in the continuum region to accommodate dislocations and intrinsic stacking faults [81]. In the continuum region, all nodes are non-local and the interatomic potential is the only constitutive relation [82,83]. As a result, there is no ghost force at the atomistic/continuum domain interface [84]. Both static [84] and dynamic [66] formulations of CAC have been developed, the latter of which has been applied to finite temperature nanoindentation problems [67,85].

#### 3.4. Coupled atomistic/discrete-dislocation (CADD)

The CADD method [86,87] couples an MD or MS sub-domain to a DDD sub-domain and allows dislocations transition between them. Pad atoms, located on the continuum side of the atomistc/continuum domain interface and deformed with the nodes, are used as an intermediary between the local continuum and the non-local atomistic regions to provide boundary conditions for the latter. In 2D, a detection band is built in the atomistic domain some short distance from the domain interface for monitoring the lattice deformation and to detect atomic-level dislocations, which are then annihilated in the atomistic region accompanied by that the same dislocation is re-built across the interface in the continuum region. Recently, the CADD method has been extended to solve 3D problems, introducing new coupling techniques to pass dislocations in lieu of the detection bands [88–93]; yet it has not been applied to 3D nanoindentation/scratching problems primarily due to some issues in modeling complex dislocation network that is common in the process. Until now, the CADD method [94,95] has been applied to 2D nanoindentation [65] and nanoscratching [96] at finite temperatures.

# 3.5. Coupling of length scales (CLS)

A CLS multiscale simulation contains a handshake region where within it, a one-to-one correspondence between MD atoms and FE nodes is obtained even though not all atomic sites are nodal positions [97–100]. The number of FE nodes decreases and the size of the corresponding elements increases while keeping out of the handshake region in the continuum domain. In the MD domain, the dynamics of particles is dominated by their interactions via the interatomic potential, while linear elasticity theory is used for particles in the FE region. The weighted function of an average Hamiltonian developed by Lidorikis and colleagues [97–100], and known as CLS, is utilized for the hybrid atom/node particles. This multiscale technique has been applied to nanoindentation [101].

## 3.6. Hot-quasicontinuum-dynamic (Hot-QC-dynamic)

The QC method,<sup>2</sup> one of the most popular multiscale modeling approaches, was first developed to simulate static properties of

<sup>&</sup>lt;sup>2</sup> http://qcmethod.org/.

crystalline solids [102]. The crucial phase in developing hot-QC, which extends the static QC to finite temperature setting, is the derivation of an effective Hamiltonian which sufficiently estimates the contributions of the unrepresented atoms in the continuum domain. This can be solved through computing the missing entropy associated with those atoms using a local harmonic or quasi harmonic approximation at the nominal set temperature. In the atomistic region, the dynamics evolves using MD with forces calculated from the effective Hamiltonian at the desired temperature. Based on the way of treating the continuum domain, two types of hot-QC are realized. In "hot-QC-static", the free energy of the continuum is minimized at each MD time step of the atomistic region. In "hot-QC-dynamic", equations of motion are introduced for the macroscopic system, so that the system essentially samples configurations close to the one that minimizes the Helmholtz free energy [103,104]. In the literature, hot-QC-dynamics has been applied to nanoindentation [103,104].

#### 3.7. Hyper-quasicontinuum (Hyper-QC)

Hyper-QC combines hot-QC (either static or dynamic variants) [103,104] and hyperdynamics [25], which is a technique for accelerating time in MD simulations, into a single framework. Hyper-QC is able to deal with the long-time simulation of systems which evolve via a sequence of rare, thermally activated events, yet where the coupling to a long-range strain field is also vital to probe the pertinent physics. For nanoindentation problems, in comparison with the unaccelerated hot-QC which is on the same time scale as classical MD, hyper-QC achieves indentation rates that are close to real experimental values for system sizes that are sufficiently large to preclude boundary effects on atomic-scale mechanisms under the indenter [26,27].

#### 3.8. Meshless Hermite-Cloud/MD

Meshless methods are very efficient in simulating strain localization problems such as nanoindentation/scratching [9,105]. Meshless Hermite-Cloud/MD multiscale technique uses MD to model the atomistic domain, the strong-form meshless Hermite-Cloud method [106] to model the continuum domain, and a handshaking algorithm to couple these domains. The meshless Hermite-Cloud technique adopts the reproducing kernel particle method (RKPM) [107], the point collocation method, and the Hermite interpolation theorem to achieve an approximate solution for both the field variable and its first-order derivative. In this way, the atomistic-continuum coupling is based on the Schwarz domain decomposition method [108]. This technique has been applied to nanoindentation [109] and nanoscratching [110].

#### 3.9. Meshless QC using temperature-related Cauchy-Born (TCB)

The TCB rule [111], which considers the locally harmonic motion of atoms, can be implemented in the meshless QC method to regard the free energy in which temperature effects are involved. Accordingly, the continuum-level stresses computed from the free energy density instead of the strain energy density are temperature-dependent. In this meshless multiscale framework, a background mesh is employed in the element-free Galerkin method (EFGM) [112] and the stress point integration method [113] is adopted to integrate the external nodal forces. Meshless QC using TCB has been used for nanoindentation [111].

#### 3.10. Molecular dynamics/dislocation dynamics/generalized interpolation material point (MD/DD/GIMP)

This multiscale simulation approach couples three different scales, viz., MD at the atomistic scale, DD at the mesoscale, and GIMP [114] at the continuum scale [115], the last of which, a particle-in-cell method, is a generalization of the material point method (MPM) [116–118] which accounts for finite spatial extent occupied by each particle [119]. DD is joined with GIMP via the principle of superposition [120]. Between the MD and DD scales, a detection band seeded in the MD region is applied to pass dislocations through the boundary using the same method adopted in 2D CADD [87]. To achieve seamless coupling in simulations at finite temperatures, spatially averaged velocities are utilized to reduce atom vibrations in the transition domain. Note that the heat exchange between MD and GIMP is not allowed and the multiscale scheme is only suitable for isothermal problems. Multiscale simulations using the MD/DD/GIMP technique have been performed to explore naonindentation [121].

# 3.11. Multiresolution molecular mechanics (MMM)

The MMM method<sup>3</sup> [122–128] is an energy-based atomistic-continuum coupling technique which employs MM description everywhere in the domain thus does not differentiate between the atomistic and continuum domains. Coarsening is achieved by means of an FE mesh to realize energy approximation by sampling the energies of groups of atoms by only a few selected atoms, and to impose kinematic constraints by using shape functions to interpolate atomic positions from nodal positions. Both static [122] and dynamic [123] forms of MMM have been developed, with adaptive mesh refinement capability. MMM has been employed to investigate 2D [127] and 3D nanoindentation problems [126].

<sup>&</sup>lt;sup>3</sup> https://sites.google.com/site/mmmmethod/.

# 3.12. Other finite temperature multiscale models

Besides the multiscale modeling methods discussed above, the finite temperature nanoindentation has also been simulated using two other atomistic-based multiscale modeling techniques. In the first model, the dynamics in the atomistic and continuum domains are coupled using displacement boundary conditions and benefits from a linear elastic [129] or quadratic constitutive law [130,131] in the continuum region to capture nonlinear effects. Thermostating is implemented using the Langevin dynamics with identical damping rate for both the continuum and atomistic domains. In the second multiscale model, an MD domain is merged to a continuum domain characterized by the Young's modulus and the Poisson's ratio [132]. The magnitudes of Young's modulus and the Poisson's ratio are similar to those predicted by the interatomic potential. This helps avoid inconsistencies in the material properties at the interface. The first layer of FEs adjacent to the atomistic region contains a set of imaginary atoms whose function is to allow force continuity between the two regions. This linking allows energy to be transmitted smoothly across the interface [132,133].

## 4. Interatomic potential

As the validity of the atomistic-based modeling results mostly relies on the selection of potential function, precautions are required when choosing the interatomic potential for a specific system and process [134–140]. Prior to making intentional selections about which interatomic potential to use, one should ensure that the potential formalism and parameters can accurately capture the required physics and fits for the target problem. For instance, the generalized stacking fault energy (GSFE) surface and elastic constants must be accurately predicted for studies involving atomic-scale plasticity mechanisms in metals. To examine high temperature solids and high-energy configurations (e.g., a disordered grain boundary (GB)), melting temperature acts as a momentous parameter [141]. Specifically for nanoindentation/scratching at finite temperatures, the interatomic potential should correctly predict the melting temperature and temperature dependent-mechanical properties of materials.

Generally, development of a potential function is an intricate process, the difficulty of which increases with the number of fitting parameters within a given formulation. For a detailed review on the systematic strategy for developing potentials, including general fitting procedures, the development of training sets, discussions of weighting schemes for cost functions, optimization strategies, and approaches to finalizing potentials for the complex systems, readers are directed to the articles by Brenner [142] and Martinez et al. [143]. There are a few tools that offer the ability to develop and optimize some interatomic potentials, e.g., the General Utility Lattice Program (GULP)<sup>4</sup> [144–146], Design and Analysis Kit for Optimization and Terascale Applications (DAKOTA)<sup>5</sup> [147], and Potential Optimization Software for Materials (POSMat)<sup>6</sup> [148]. Notice that the choice of the interpolation scheme is also a crucial factor for that even with the correct potential formulation, different interpolation might give different results<sup>7</sup> [149].

#### 5. Nanoindentation

The development of finite temperature nanoindentation has provided an opportunity to understand fundamental materials behaviours driven by both temperature and stress. Atomistic-based modeling of finite temperature nanoindentation, though not as abundant as that at zero temperature in the literature, has brought forth important physical insights regarding inherent mechanical properties and deformation propensity of materials at finite temperatures. In the following, we review atomistic-based modeling results in a problem-centric manner to explore the influences of temperature and loading rate on the nanoindentation process.

#### 5.1. Effects of temperature

Temperature can affect nanoscale plasticity mechanisms and thermal softening processes acting beneath the indenter, leading to the variation of nanomechanical response of materials. For example, CADD nanoindentation studies of Al, modeled by the embeddedatom method (EAM) potential of Daw and Baskes [150], as seen in

Fig. 1(a), established that temperature influences the onset of plasticity or dislocation nucleation. Temperature rise from 0 to 400 K triggers the earlier occurrence of dislocation nucleation, as demonstrated in Fig. 1(b), which are in line with the results obtained from fully resolved atomistic simulations [65]. Interestingly, 2D nanoindentation using MD/DD/GIMP framework reveals that, while using a wedge indenter, the onset of dislocations is independent of substrate temperature in the range of 0–300 K, and the load-displacement (*P*-*h*) curves are found to overlap each other in this temperature range [121].

Fig. 2 demonstrates the hot-QC-dynamic simulation model of nanoindentation of Ni, modeled by the EAM potential of Angelo et al. [151]. This simulation cell, consisting of 4542 representative atoms, exhibits a significant decrease of the degrees of freedom as opposed to the 790,000 atoms in the equivalent fully atomistic simulation. Hot-QC-dynamic simulations disclose softening of the *P*-*h* curve, with the nonlinear decrease of critical load for dislocation nucleation with increasing temperature (Fig. 2(b)). This is expected since nucleation of dislocations is a thermally-activated non-linear process [103].

Multiscale modeling of the nanoindentation of Al [133], modeled by Brenner potential [152,153], establishes that at 300 K, slip

<sup>&</sup>lt;sup>4</sup> https://gulp.curtin.edu.au/gulp/.

<sup>&</sup>lt;sup>5</sup> https://dakota.sandia.gov/.

<sup>&</sup>lt;sup>6</sup> https://data.mendeley.com/datasets/shgx2kbr79/1.

<sup>&</sup>lt;sup>7</sup> https://openkim.org/.



Fig. 1. Discrete dislocations (yellow circles) and atomic region at (a–b) maximum load and (c–d) after unloading obtained by finite temperature CADD; (e) *P*-*h* curves for three different temperatures. Adopted with permission from Ref. [65].



Fig. 2. (a) Mesh of the hot-QC-dynamic after dislocation nucleation at T = 100 K; (b) *P*-*h* curves. Arrows designate the first nucleation of dislocation. Adopted with permission from Ref. [103].

occurs in {111} planes, migrating downward under the indenter. At 650 K, slipped atoms, relative to their neighbours, behave differently compared to those at 300 K. In this case, the atomic motion is more like a viscous flow than slip in well-defined planes and directions [133].

Fig. 3 demonstrates the process of dislocation climb of half prismatic loops at 950 K obtained by an MD simulation of nanoindentation of Au on its (1 1 1) crystal plane using the EAM potential of Grochola et al. [154]. Monoatomic jogs are formed on the dislocation segment and they rapidly climb towards the upper surface, shrinking the loops in a direction parallel to the upper surface which leads to the annihilation of half prismatic edge dislocation loops via pipe diffusion of vacancies from the free surface. Furthermore, the annihilation time and critical loop radius below which pipe diffusion is dominant decrease with increasing substrate temperature [155]. Note that below 800 K, edge dislocation climb is not perceived during MD simulations of Au (1 1 1).

High temperatures shift the onset of plasticity, i.e. nucleation of the first dislocation, to a lower indentation depth regime in single crystalline cubic silicon carbide (3C-SiC) substrates, attributable to the thermally-activated nature of defect formation. Fig. 4 reveals that intrinsic stacking faults (ISFs), surrounded by Shockley partials, can be formed within the prismatic loops at temperatures higher than 1000 K during nanoindentation of a 3C-SiC single crystal. In nanotwinned 3C-SiC samples subjected to nanoindentation loading, it is found that dislocation-coherent twin boundary (CTB) interactions and transmission mechanisms at high temperatures are akin to those at low and room temperatures, i.e. nucleation of twinning partial dislocations and formation and annihilation of point defects at



**Fig. 3.** The process of dislocation climb of half prismatic loops at 950 K in the MD simulation of nanoindentation of Au (1 1 1). (a) Two in-plane dislocations are shown; (b) the dislocation on the right shrinks, leaving an atomic layer of material pileup on the free surface until complete annihilation on a later stage, as shown in (c); (c) the second in-plane dislocation starts shrinking and annihilates like the first one, leaving an atomic layer of material pileup at the free surface. Adopted with permission from Ref. [155].

the CTB, suggesting that the transmission mechanisms are not temperature-dependent [156].

As evident from Fig. 5, high temperature nanoindentation of chromium (Cr) and chromium nitride (CrN) coatings [157], modeled by Morse potential function [158], and Ni<sub>3</sub>Al (1 1 1) [159], modeled by the EAM potential of Du et al. [160], reveal the formation of vacancies, slips, and nucleation of dislocations in the material structure prompted by variations in the temperature. In all, these atomistic-based predictions pose interesting questions regarding the apparent role of thermally activated mechanisms during nanoindentation of various materials.

Besides the plastic deformation mechanism, temperature also affects mechanical properties, e.g., Young's modulus and hardness. Nanoindentation studies by multiscale modeling of CADD [65], AFEM [71], CLS [101], BCM [79], and meshless QC using TCB [111], etc., confirm the deterioration of certain mechanical properties and indentation load with increasing temperature, which have been reported by MD studies as well for a wide range of materials. For example, a higher temperature results in decreasing hardness, Young's modulus, and elastic recovery of Cu and Au, modeled by tight-binding-second-moment approximation (TB-SMA) [161] and Morse [162] interatomic potential functions [163–165]; decreasing elastic modulus of the Au and Al [166] using TB potentials [167]; decreasing hardness of nanotwinned single and nanocrystalline 3C-SiC, modeled by Vashishta potential [168], with a more pronounced temperature effects for the nanocrystalline samples [156]; decreasing plastic energy, indentation load, and adhesion of Al/ Ni multilayered films [169], modeled by a TB-SMA potential [170]; decreasing load, contact pressure, indentation modulus, and maximum shear stress of Ni<sub>3</sub>Al (1 1 1) [159], modeled by the EAM potential of Du et al. [160]; decreasing load, Young's modulus, elastic and plastic energy of the  $C_{60}$ -filled carbon nanotube (CNT) [171], modeled by Tersoff potential [172–175]; decreasing hardness of Cr and CrN [157]; decreasing load and hardness of cubic boron nitride (cBN) (001) film, modeled by a modified Tersoff potential [176]; as well as decreasing Young's modulus, maximum loading displacement, and load stress of single-layer molybdenum disulphide (MoS<sub>2</sub>), modeled by Stillinger-Weber (SW) [177] and reactive empirical bond order (REBO) [178] interatomic potentials [179,180]. These decreases of nanoindentation hardness, modulus, and loads with increasing temperature may be attributed to the increase of the amplitude of atomic vibration, which leads to thermal expansion and reduces the energy needed to change the atomic bonds. It is informative to note that the nanomechanical response of materials at elevated temperatures qualitatively interprets the usefulness of a heated array of tips in indenting or a heated mold in stamping a fairly soft material, which can be crucial to the



**Fig. 4.** An atomistic snapshot of MD simulation of nanoindentation test showing the formation of ISFs, surrounded by Shockley partials (green lines), within the prismatic loops in the single crystalline 3C-SiC substrate at T = 2000 K.



Fig. 5. (a) MD snapshots showing the formation of vacancies and slips in nanoindentation of CrN thin film at 400 K and 900 K, respectively; (b) extended dislocation nucleation at high temperatures during nanoindentation of  $Ni_3Al$  (111). Adopted with permission from Refs. [157,159].

mechanisms involved in nanofabrication processes, e.g., nanoimprint lithography technologies [165].

In addition to the crystalline materials, the material behaviour of amorphous compounds, e.g., bulk metallic glasses (BMGs), subjected to nanoindentation is also of interest. Prior MD nanoindentation studies have brought into attention some important features on the mechanistic aspect of these alloys drawing examples on Ni<sub>50</sub>Zr<sub>50</sub> modeled by TB-SMA potential [181]. For temperatures around and above the glass transition temperature  $(T_{z})$  of Ni<sub>50</sub>Zr<sub>50</sub>, i.e. ~748 K, the nanoindentation hardness does not decrease with increasing temperature. In fact, the hardness and slip vector distribution do not vary in the temperature range of 700–900 K, plausibly due to the change of the material state from solid to high-viscosity liquid [182]. From the perspective of free volume theory [183–185], during the formation process of metallic glasses, there is necessarily ample free volume in their structure. When the simulation temperature rises, the motion of atoms is intensified. Accordingly, the free volume slowly decreases and atoms rearrange, gradually forming ordered regions. Following above, the motion and migration of atoms are limited to a small region and the increase of shear transformation zones (STZs) results in the tendency to increasing the elastic modulus. However, when free volume decreases to a certain degree, where atoms become random-close-packed and their motion is limited, the development of STZs is restrained. This causes fluctuation of material properties and the decrease of elastic modulus. Afterwards, when the temperature continues to rise, there is further release of energy between atoms. Meanwhile, the free volume begins to expand and the motion of atoms is motivated to become active again. At the same time, the size of STZs starts increasing again. Finally, as the temperature surpasses Tg, STZs constantly form and grow, tending to expand and consequently the elastic modulus increases rapidly under the effect of these tiny STZs. Thus, as the temperature gradually rises, the elastic modulus of the substrate tends to change, which is mainly due to the effect of STZs and the change of the free volume. Such behaviour has been observed for the metallic glass  $Cu_{50}Zr_{50}$  [186] modeled by an EAM potential [187], and  $Ni_{70}Al_{30}$  alloy [188] modeled by a TB potential [167]. On the whole, metallic glasses have features of rubber and protein-like materials, and behave differently compared to regular metals and alloys, i.e., metallic glasses become stiffer before glass transition [189].

It is instructive to mention that the nanoindentation hardness and Young's modulus obtained by atomistic-based simulations are higher than the corresponding experimental magnitudes, albeit a quantitative agreement is realized. This discrepancy could stem from the: high loading rates in MD, indentation size effect (ISE), dissimilar crystal texture used in MD and experiments, true contact area issues, limited dislocation activity in MD due to the specimen scales, scatter in experimental measures, and surface roughness in experimental specimens.

# 5.2. Effects of loading rate

The hyper-QC simulations of single crystalline Ni reveal a thermally activated nucleation process where the force required to nucleate the first partial dislocation is logarithmically dependent on both the temperature and indenter velocity. The results from hyper-QC, hot-QC, and fully atomistic MD simulations could collapse onto a single curve derived from a simple mathematical model based on thermal activation and linear relations. Notice that in the hyper-QC model, the reduction of the indenter velocity by three orders of magnitude relative to unaccelerated hot-QC simulations is enabled by the introduction of a novel mechanism-based bias potential designed to accelerate the dislocation nucleation process [26,27].

Different dislocation structures are formed under indenter during nanoindentation of Cu, modeled by the Mishin EAM potential [190], at 900 K at different loading rates. Fig. 6 demonstrates the dislocation arrangement generated after the first large load drop for



**Fig. 6.** Effects of loading rate on dislocation structure revealed by DMD. (a) Dislocation nucleation at low loading rate, and high loading rate (in the inset); (b) *P*-*h* curve demonstrates reduced dislocation nucleation load as a result of the surface vacancy disk/terrace generated by prior diffusion. Adopted with permission from Ref. [23].

the slow loading rate  $(4.89 \times 10^{-3} \text{ Å}/\tau)$  revealed by DMD [23], where the surface step offers favoured sites for heterogeneous dislocation nucleation nearby surface defects. This behaviour is considerably different from that of the faster rate case  $(4.89 \times 10^{-3} \text{ Å}/\tau)$ , depicted in the inset of Fig. 6(a), where dislocation loops are formed homogeneously inside the bulk. Indentation load also decreases with decreasing loading rate [23]. Likewise, Meshless Hermite-Cloud/MD studies of nanoindentation of Cu, modeled by Morse potential of Inamura et al. [191], reveal decrease of indentation load with the decrease of loading rate [109,192]. Low indentation speeds, e.g., 5 and 10 m/s, bring about a more homogenous nucleation and propagation of lattice dislocations in

ow indentation speeds, e.g., 5 and 10 m/s, bring about a more homogenous nucleation and propagation of lattice



**Fig. 7.** Atomic flow field obtained in MD simulation of nanoscratching/cutting of Si (110) at various temperatures. The red arrows demonstrate displacement vectors of atoms with their lengths indicating the amount of displacement. Highly distorted atoms are highlighted by grey circles. The vertical line in the last subfigure denotes the boundary layer, in which atoms do not move. Adopted with permission from Ref. [199].

the nanotwinned single crystalline 3C-SiC than those of higher indentation speeds. Also, a careful examination of the evolving dislocation structure under the indenter uncovers that the onset of plastic deformation is delayed at higher indentation speeds. In nanotwinned nanocrystalline 3C-SiC, GB and CTB accommodation processes along with low dislocation activity are found as the mediators of the plasticity at low indentation speeds up to 50 m/s, however, at higher speeds, i.e., 100 m/s, the contribution of GB sliding and CTB migration is more pronounced. Detailed analysis of the indentation hardness unravels that hardness increases with the indentation speed in nanotwinned single/nanocrystalline 3C-SiC, however, a slight decrease transpires for the nanotwinned nanocrystalline sample while increasing the indentation speed from 50 to 100 m/s, which may be attributed to the improved GB sliding at high indentation speeds. Another remarkable point is that decreasing the indentation speed lowers the onset of plasticity of the nanotwinned single crystals, i.e. pop-in load reduces by ~ 29% and ~ 32% when decreasing the indentation speed from 100 to 5 m/s [156].

#### 6. Nanoscratching

Almost all the literature on the multiscale modeling of nanoscratching is centered on discussions of zero temperature nanoscratching [193–198]. On the other hand, the available literature reveals that MD simulation of nanoscratching has been primarily concentrated in demystifying the occurring mechanisms at room temperature. Thus, the current pool of knowledge on high/finite temperature nanoscratching is sparse. Accordingly, there are tremendous opportunities to develop/adopt finite temperature multiscale models and high temperature MD simulations to explore the overall response of materials under nanoscratching conditions and to perform parametric studies on state variables which are experimentally difficult to access. On the basis of existing literature, we present parameter-specific case studies of nanoscratching/cutting in this section. Note that regardless of indenter/cutting tool shape and lateral forces, material removal and nanoscale plasticity mechanisms underneath the indenter/cutting tool in nanoscratching and nanometric cutting are assumed to be almost identical. Thus, the observed results are interchangeable [137].

# 6.1. Effects of temperature

An MD study of plastic deformation mediated flow behaviour of single crystalline Si and 3C-SiC reveals that the rotational flow of atoms beneath the indenter/cutting tool diminishes linearly when the temperature of substrate increases [199,200], as demonstrated in Fig. 7, plausibly owing to the occurrence of thermal softening which, in turn, improves the plasticity of the substrate. The atomic flow in the substrate is a laminar flow at room temperature whilst at higher temperatures the flow of the material is seemingly turbulent. Also, it is found that thinner and taller chips (pile-up) form and deformation layer depth in the substrate becomes greater under high temperature conditions. Moreover, shear plane angle increases while scratching/cutting at high temperatures, signifying that shear plane has a smaller area, thus, shear occurs in a more narrowed zone leading to lower shear forces [200,201]. Decrease of critical von Mises stress triggering flow and scratching/cutting forces with increasing substrate temperature have also been reported for Si [200], 3C-SiC [202], and metallic glass NiAl [203].

MD simulation studies of nanoscratching/cutting of Si using SW potential function [204] have recently revealed the stochastic formation of dislocations and stacking faults at various temperatures, where perfect 60° dislocations prevail perfect screw dislocations and partial dislocations. In 3C-SiC, modeled by analytical bond order potential (ABOP) [205], formation and subsequent annihilation of stacking fault-couple and Lomer-Cottrell (L-C) lock at high temperatures, i.e. 2000 K, could occur. Additionally, cross-junctions between pairs of counter stacking faults meditated by the gliding of Shockley partials on different slip planes are formed at 3000 K during nanoscratching/cutting of the 3C-SiC(1 1 0)  $\langle 0 0 \bar{1} \rangle$  crystal setup [206]. Such results are particularly beneficial, in that they



**Fig. 8.** Nanofrictional force of (a) ploughing; (b) grazing tip on NaCl (1 0 0). Near melting temperature  $T_{M}$ , friction drops as in skating for the sharp (ploughing) tip whereas the blunt tip, grazing on the surface, experiences an increase in friction. Adopted with permission from Ref. [210].

provide a strong physical argument for the genesis of the mechanisms involved in crystal plasticity of Si at high temperatures. Given the development of a new potential function for Si by Pun and Mishin [207], and Vashishta potential function [168] for the 3C-SiC, which can accurately reproduce a great variety of properties including GSFE, it is worthwhile to revisit the defect formation of these materials under localized strain problems at elevated temperatures using these potential functions.

A well-known approach to quantify crystals in MD simulation is the virtual X-ray diffraction (XRD) developed by Coleman et al. [208]. Using this technique, it is established that the intensity peaks are not shifted at higher temperatures before nanoscratching/ cutting of Si and 3C-SiC, suggesting that interplanar spacings do not change. Nevertheless, main peaks are abated significantly after scratching/cutting, and numerous new diffractions emerge, signifying the occurrence of a transformation towards an amorphous configuration in the scratching/cutting region [206,209].

Besides the effects on plasticity, the temperature also influences the nanoscratching process from which much nanotribology information that is not available in nanoindentation (Section 5.1) can be obtained. Zykova-Timan and co-workers [210] have conducted an interesting MD study showing a frictional drop close to melting point of NaCl (100), modeled by the classic Born-Mayer-Huggins-Fumi-Tosi (BMHFT) two-body potential [211,212], for deep ploughing and wear. In contrast, an increase of friction for grazing, wearless sliding is achieved. As shown in Fig. 8, for deep ploughing and wear, a frictional drop as in skating close to melting point takes place, whereas a frictional rise as in flux lattice depinning for grazing, wearless sliding occurs. Meticulous inspection of the contact zone reveals that the sharp tip resembles a skate on an ice rink, where the surface is locally molten: the sharp tip is accompanied by a small fluid cloud and skates on the hot NaCl surface. Ostensibly, the scale of these interning phenomena can be relevant to future MEMS/NEMS made by Si. Although the choice of NaCl for the MD simulations appears more academic, the disappearance of friction phenomenon might happen on other non-melting surfaces, e.g., Al(111) or Pb(111). Hence, the work evidently directs attention to the ploughing configuration as a goal to attain minimum friction in high temperature applications [213]. However, the melt lubrication process imposes a dilemma, i.e., diminishing the surface strength as opposed to the nearly zero friction surface. It appears that the predictions of Zykova-Timan and colleagues [210] correlate with the previously reported results in the 1990s regarding the use of liquid metals for friction reduction [214,215]. Nonetheless, experiments show that the friction behaviour upon melting may depend on the alloy composition [216]. By and large, it is enticing to perform high temperature and high velocity nanoscale studies to further explore the influence of liquid film formed at the interface upon melting on the frictional behaviour.

Another crucial point is that high temperature nanoscratching enhances plastic deformation of substrate which directs us to expect lower wear of diamond indenter. However, it should be borne in mind that high heat content could lead to wear of diamond indenter, viz., high temperature can prompt accelerated wear of carbon atoms via diffusion, attrition, adhesion, etc. Given the importance of this topic, it is worthwhile to examine the wear mechanisms and phase transformation of the indenter at elevated temperatures using atomistic-based simulations in vacuum as well as in the presence of oxygen atoms, which could potentially suggest ways to improve wear resistance and to propose new materials/coatings for high temperature applications.

# 6.2. Effects of scratching speed and depth

The tangential and normal forces are dependent on the scratching speed and depth. As revealed by CADD [96], the average magnitude of normal forces of the Al substrate, modeled by EAM potential of Daw and Baskes [150], increases rapidly at scratching speeds over the propagation speed of plastic wave. As depicted in Fig. 9, the average normal force decreases up to the scratching speed of 400 m/s, followed by a sudden rise at 800 m/s. This trend could be attributed to the transition from crystal plasticity owing to lattice dislocation motion to an amorphization process, which might be related to the loss of lattice stability in CADD simulations.



Fig. 9. Variation of average tangential and normal forces with scratching speed during nanoscratching of Al obtained by CADD. Adopted with permission from Ref. [96].

Also, much smoother surface is obtained while scratching at high speeds. However, the outcome from Meshless Hermite-Cloud/MD of Cu [110] contradicts the findings from the CADD [96], i.e., the tangential and normal forces increase with increasing scratching speed in the range of 10–400 m/s.

Meshless Hermite-Cloud/MD [110] and CADD [96] studies of Cu an Al, respectively, at room temperature demonstrates a linear increase of normal and frictional forces with increasing scratch depth, yet the coefficient of friction remains almost constant [110]. As depicted in Fig. 10(a), CADD studies of tangential force curve reveal huge drops at certain points, corresponding to the nucleation of some dislocations shown in Fig. 10(b) and (c). Larger scratching depth would also trigger higher levels of dislocation nucleation and plastic deformation ahead of the indenter [96].

#### 6.3. Effects of cutting plane/direction

The mode of nanoscale plasticity at different temperatures is cutting plane/direction-dependent, e.g., in Si and 3C-SiC, while low defect activity transpires for the  $(0\ 1\ 0)[1\ 0\ 0]$  and  $(1\ 1\ 1)[\overline{1}\ 1\ 0]$  crystal setups, formation of dislocations and stacking faults prevails during scratching/cutting the  $(1\ 1\ 0)[0\ 0\overline{1}]$ , attributable to the ease of activating slip systems in this crystal setup [206,209]. In the former cases, amorphization and weak bonding between atoms govern the plasticity at high temperatures. Additionally, regardless of the temperature, the stacking faults, which are not formed for both the  $(0\ 1\ 0)[1\ 0\ 0]$  and  $(1\ 1\ 1)[\overline{1}\ 1\ 0]$  crystal setups, are generated with three atomic layers in the  $(1\ 1\ 0)[0\ 0\ 1]$  during scratching/cutting of Si [209]. Detailed analysis of atomic flow demonstrates that while scratching/cutting  $(1\ 1\ 1)$  crystal plane, the center of rotational flow, shown in Fig. 7, is located at a lower position than those on the other crystal planes, thus, providing a more effective flow of the atoms which eases the material removal process. For this crystal plane, irrespective of the temperature, the stagnation region, where the shearing action (leading to chip formation) separates from the compressive action beneath the indenter, is located at an upper position than that for the  $(0\ 1\ 0)$  and  $(1\ 1\ 0)$  orientations, signifying that ploughing due to compression is relatively higher on the  $(1\ 1\ 1)$  plane and thus the extent of deformed surface and subsurface, leading to higher spring-back, is more pronounced for this orientation [199]. Besides, smaller critical von Mises stress, resultant force, and friction coefficient at the indenter/chip interface is visible while scratching/cutting the  $(1\ 1\ 1)$  surface, as opposed to the surfaces on other crystallographic planes [200–202].

#### 7. Summary and outlook

The role of modeling and simulation has become crucial in the growth of nanomechanics and nanotribology, in which microscopic processes are experimentally inaccessible, to make momentous predictions and reveal hitherto unknown phenomena. In particular, modeling of the nanomechanical responses of materials systems and deformation mechanisms of surface atoms in contact regions of MEMS/NEMS under various forms of loading at service temperatures are of relevance to industrial application. Of the wide variety of materials characterisation techniques, nanoindentation/scratching is one of the most rigorous approaches to gain information about local material properties, as well as fundamental deformation mechanisms. Accordingly, modeling of nanoindentation/scratching at finite temperatures opens up significant new possibilities, shedding light on the fundamental mechanisms of surface plasticity and the tribological behaviour of thin films. Two types of atomistic-based modeling approach have primarily been pursued to explore finite temperature nanoindentation/scratching of materials – MD simulation and atomistic-based multiscale modeling. In many cases, the availability of sufficiently efficient interatomic potentials providing reliable energies and forces could become a bottleneck for performing finite temperature simulations. It is critical to ensure that the interatomic potential formalism used in MD and multiscale modeling accurately captures the relevant physics and fits that type of problem. Specifically for finite temperature nanoindentation/



Fig. 10. (a) Variation of tangential force as a function of scratching depth. Points *I-IV* correspond to dislocation nucleation events; (b) and (c) Dislocation nucleation between points *III* and *IV* shown in (a). The results were obtained by CADD. Adopted with permission from Ref. [96].

scratching, the selected interatomic potential ought to precisely predict melting temperature, temperature-dependent mechanical properties, GSFEs, and point defect structures at finite temperatures. Development of long-range interatomic potentials and formalisms with higher levels of transferability, i.e., the capability of accurately predicting mechanical and thermal properties as well as defect and dislocation core structures of materials at high temperatures, is promising. Recent years have seen a rising interest in machine learning potentials. Although machine learning potentials are very slow, they enable achievement of an impressive accuracy of interpolation between density functional theory energies, in some cases up to a few meV/atom. However, lack of transferability to configurations outside the training dataset remains an issue [227].

Fewer MD simulations have been carried out for nanoindentation at high temperatures (> 300 K) than those at lower temperatures, and most of them focused on investigating the variation of modulus, hardness, and elastic recovery with temperature. The discovery of deformation modes and nanoplasticity mechanisms acting beneath the indenter at high temperatures, as well as material flow behaviour, require further examination in order to ascertain the role of deformation phenomena on the nanomechanical responses of different materials systems such as multi-layered films, nanocrystalline materials, polycrystalline structures, and nanocomposites at elevated temperatures. Also, from the MD simulation assessment, one can examine the influence of oxide layers on the nanomechanical behaviour of thin films at high temperatures. To that end, oxygen atoms should be included in the MD models and robust potential functions have to be used to describe interatomic interactions between oxygen atoms and other atoms in the system. It also remains to be seen how temperature affects the defect formation mechanisms involved in nanoplasticity of semiconductor materials upon nanoindentation/scratching loading, which will assist in enhancing our understanding of physical response of these materials. Specifically, the ongoing debate regarding the occurrence of high pressure phase transformation (HPPT) in Si and the role of temperature on the rate of HPPT at a strictly nanometer level in a defect-free sample employed in MD trials could benefit from further atomistic calculations. It is worth noting that as empirical interatomic potentials are parameterized for a particular local environment of atomic configurations, they are generally not designed for conditions where the number of interacting neighbours can alter suddenly, e.g., during nanoindentation/scratching loading. Thus, interatomic potentials like Tersoff [172–175], being a nearestneighbour model, are expected to become aphysical in the high pressure regime when the second-neighbours come within the range of what was defined to be the first-neighbour range [217]. It is, therefore, vital to ensure that the employed interatomic potential is reliable in describing and capturing all the structural phases of Si at different temperatures. Besides nanoindentation, very few MD studies on high temperature nanoscratching/cutting have been reported in the literature. More research on this topic is likely to appear in the coming years.

From a multiscale modeling perspective, a review of the available literature reveals that the complicated but very promising atomistic-based multiscale models for finite temperature nanoindentation/scratching, capable of passing dislocation and heat between atomistic and continuum domains, offer a unique alternative to overcoming the spatial limitations of MD. Nevertheless, it should be considered that MD plays a central role in multiscale modeling and, indeed, is employed as a fundamental basis in most multiscale modeling approaches. Particularly, accelerated MD schemes, e.g., hyperdynamics [25], parallel replica method [218], temperature-accelerated dynamics [219], which aim to tackle the restricted time scale accessible in conventional MD simulations, can be incorporated into atomistic-based multiscale methods to speed up simulations. Nevertheless, it should be borne in mind that MD is not a very reliable choice for non-equilibrium high temperature simulations in metals/metallic superalloy, metallic glasses, and some high-conductivity semiconductors, since electrons (which cannot be directly modeled in classical MD) dominate heat transfer in them, but not in insulators, e.g., carbon. For quasi-static, zero temperature problems, multiscale techniques are well understood and developed. However, multiscale methods encounter important challenges at high temperatures because of the incompatible interface stemming from non-local atomic and local continuum descriptions. This artificial interface induces the ghost forces and spurious phonon reflection, which trigger the temperature gradient and seriously interfere with the dynamical equilibrium in the entirely coupled model. This can be termed as the greatest challenge for developing high temperature multiscale models. In experimental systems, rapid vibrations would be converted to heat by viscoelastic damping in the solid or incoherent scattering at boundaries or impurities. Except in extremely small systems and at high velocities, coherent reflections from boundaries do not appear to play an important role in the dynamics. The key goals of developing high temperature multiscale models for nanoindentation/scratching should therefore include restricting spurious reflections at artificial boundaries such as the handshake region and minimise reflections at real boundaries by damping waves or ensuring that the phonon scattering is incoherent. Some recently developed algorithms can reduce reflections at the boundaries of atomistic regions, yet transmission of crucial low-frequency strain waves might also be influenced and these remain limited to linear constitutive laws. Moreover, the use of non-linear constitutive law in the continuum domain is highly recommended because non-linear effects become substantial at strains of about 0.3%, and compressive strains imposed by the indenter remain above this level far below the surface [130]. An ambitious goal would be developing physics-based crystal plasticity [220,221] models capable of capturing the hardening/softening effects, lattice rotation, and texture evolution encountered in materials by incorporating linear and planar defects (e.g., dislocations, stacking faults, twinning, GBs) in the continuum domain in order to accurately capture the deformation behaviour of materials [222]. Implementing dynamic remeshing algorithms which expand or shrink the atomistic region in response to changing stresses also poses promising future endeavours. In addition, many existing multiscale approaches are only suitable for 2D simulations. 3D dynamic multiscale methods need to be developed for high temperature nanoindentation/scratching. Research on multiscale methods combining meshless or particle techniques for continuum discretisation and the MD method for finite temperature nanoindentation/scratching are also very promising [223–225]; yet a few efforts in this direction have focused on static limits. It is possible to confidently predict intensified research in the arena of finite temperature meshless/particle-based multiscale methods comprising dislocations, which may be used in many contact problems. To further improve the fidelity of multiscale modeling, atomic dynamics needs to include quantum effects, e.g., zero point energies and non-classical phonon scattering, and trajectories involving excited electronic states in insulators (including transitions between states and effects such as avoided crossings) [31]. Also, multiphysics models that incorporate fundamental understanding and parameters derived from MD and quantum mechanical calculation can provide a powerful approach to nano/microstructural evolution of materials under nanoindenter [28]. It can be concluded that research into multiscale modeling of nanoindentation/scratching at finite temperatures is in its infancy. In the upcoming years, we will become acquainted with more fundamental knowledge about consistent thermodynamics in the continuum-atomistic coupling scheme. The future of multiscale modeling of nanoindentation/scratching at finite temperatures is therefore very promising and more applications remain to be conducted.

It should be emphasized that one of the most interesting and relevant topics to which MD and multiscale modeling of high temperature nanoscratching can be applied is nanotribology at high temperatures. Such studies enhance our understanding about the frictional behaviour of different materials and compounds at high temperatures, particularly around melting temperatures, where Zykova-Timan and colleagues [210] reported a drastic frictional drop upon melting. High temperature nanotribological studies could therefore aid in determining regimes for ultra-low friction and near-zero wear. MD and multiscale simulation studies can also shed light on the atomic origins of wear mechanisms, adhesion, friction, and phase transformation of indenters at elevated temperatures in vacuums as well as in the presence of oxygen, which could suggest ways to improve wear resistance and propose new materials/ coatings for high temperature applications. Finally, a one-to-one comparison between modeling and experimental approaches is lacking, primarily because of the length/time scale issues and the difficulty in the application of pristine, defect-free samples in modeling [226]. In our opinion, atomistic-based multiscale methods offer the best hope for bridging the traditional gap that exists between experimental and theoretical approaches and computational modeling for studying and understanding the materials responses under nanoindentation/scratching.

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## References

- [1] Broitman E. Indentation hardness measurements at macro-, micro-, and nanoscale: a critical overview. Tribol Lett 2017;65:23.
- [2] Chavoshi SZ, Xu S. Temperature-dependent nanoindentation response of materials. MRS Commun 2018;8:15–28.
- [3] Chavoshi SZ, Xu S. A review on micro- and nanoscratching/tribology at high temperatures: instrumentation and experimentation. J Mater Eng Perform 2018;27:3844–58.
- [4] Carpick RW, Salmeron M. Scratching the surface: fundamental investigations of tribology with atomic force microscopy. Chem Rev 1997;97:1163–94.
- [5] Consiglio R, Randall N, Bellaton B, Von Stebut J. The nano-scratch tester (NST) as a new tool for assessing the strength of ultrathin hard coatings and the mar resistance of polymer films. Thin Solid Films 1998;332:151–6.
- [6] Tsui T, Pharr G, Oliver W, Chung Y, Cutiongco E, Bhatia C, et al. Nanoindentation and nanoscratching of hard coating materials for magnetic disks. MRS proceedings. Cambridge Univ Press; 1994.
- [7] Xu S, Rigelesaiyin J, Xiong L, Chen Y, McDowell DL. Generalized continua concepts in coarse-graining atomistic simulations. Generalized Models and Nonclassical Approaches in Complex Materials, 2. Springer; 2018. p. 237–60.
- [8] Curtin WA, Miller RE. Atomistic/continuum coupling in computational materials science. Model Simul Mater Sci Eng 2003;11:R33.
- [9] Park HS, Liu WK. An introduction and tutorial on multiple-scale analysis in solids. Comput Methods Appl Mech Eng 2004;193:1733-72.
- [10] Ruestes CJ, Alhafez IA, Urbassek HM. Atomistic studies of nanoindentation—a review of recent advances. Crystals 2017;7:293.
- [11] Huang S, Zhou C. Modeling and simulation of nanoindentation. JOM 2017;69:1-8.
- [12] Sholl D, Steckel JA. Density functional theory: a practical introduction. John Wiley & Sons; 2011.
- [13] Li J, Ngan AH, Gumbsch P. Atomistic modeling of mechanical behavior. Acta Mater 2003;51:5711-42.
- [14] Elber R, Karplus M. A method for determining reaction paths in large molecules: application to myoglobin. Chem Phys Lett 1987;139:375-80.
- [15] Henkelman G, Jónsson H. Improved tangent estimate in the nudged elastic band method for finding minimum energy paths and saddle points. J Chem Phys 2000;113:9978–85.
- [16] Henkelman G, Uberuaga BP, Jónsson H. A climbing image nudged elastic band method for finding saddle points and minimum energy paths. J Chem Phys 2000;113:9901–4.
- [17] Zhu T, Li J, Lin X, Yip S. Stress-dependent molecular pathways of silica-water reaction. J Mech Phys Solids 2005;53:1597-623.
- [18] Zhu T, Li J, Yip S. Atomistic study of dislocation loop emission from a crack tip. Phys Rev Lett 2004;93:025503.
- [19] Sutmann G. Classical molecular dynamics. Published in quantum simulations of complex many-body systems: from theory to algorithms, lecture notes, vol. 10; 2002. p. 211–54, ISBN: 3-00-009057-6.
- [20] Allen MP. Introduction to molecular dynamics simulation. Published in computational soft matter: from synthetic polymers to proteins, lecture notes, vol. 23; 2004. p. 1–28, ISBN: 3-00-012641-4.
- [21] Landman U, Luedtke W, Burnham N, Colton R. Atomistic mechanisms and dynamics of adhesion, nanoindentation, and fracture. Science 1990;248:454-61.
- [22] Hoover WG, De Groot AJ, Hoover CG, Stowers IF, Kawai T, Holian BL, et al. Large-scale elastic-plastic indentation simulations via nonequilibrium molecular dynamics. Phys Rev A 1990;42:5844.
- [23] Li J, Sarkar S, Cox WT, Lenosky TJ, Bitzek E, Wang Y. Diffusive molecular dynamics and its application to nanoindentation and sintering. Phys Rev B 2011;84:054103.
- [24] Sun X, Ariza M, Ortiz M, Wang K. Acceleration of diffusive molecular dynamics simulations through mean field approximation and subcycling time integration. J Comput Phys 2017;350:470–92.
- [25] Voter AF. A method for accelerating the molecular dynamics simulation of infrequent events. J Chem Phys 1997;106:4665–77.
- [26] Kim W, Tadmor E. Accelerated quasicontinuum: a practical perspective on hyper-QC with application to nanoindentation. Philos Mag 2017;97:2284–316.
- [27] Kim WK, Luskin M, Perez D, Voter A, Tadmor E. Hyper-QC: an accelerated finite-temperature quasicontinuum method using hyperdynamics. J Mech Phys Solids 2014;63:94–112.

- [28] Gerberich W, Tadmor EB, Kysar J, Zimmerman JA, Minor AM, Szlufarska I, et al. Ballarini: case studies in future trends of computational and experimental nanomechanics. J Vac Sci Technol A: Vac Surf Films 2017;35:060801.
- [29] Arndt M, Griebel M. Derivation of higher order gradient continuum models from atomistic models for crystalline solids. Multiscale Model Simul 2005;4:531-62.
- [30] Aubertin P, Réthoré J, De Borst R. Energy conservation of atomistic/continuum coupling. Int J Numer Meth Eng 2009;78:1365–86.
   [31] Brenner DW. Challenges to marrying atomic and continuum modeling of materials. Curr Opin Solid State Mater Sci 2013;17:257–62.
- [31] Breiner Dw. Chanenges to marrying atomic and communi modering of materials. Curr Opin sond state water Sci 2013;17:257-02.
- [32] Rodney D, Tanguy A, Vandembroucq D. Modeling the mechanics of amorphous solids at different length scale and time scale. Model Simul Mater Sci Eng 2011;19:083001.
- [33] Horstemeyer MF. Multiscale modeling: a review. Practical aspects of computational chemistry. Springer, 2009. p. 87–135.[34] Miller RE, Tadmor EB. A unified framework and performance benchmark of fourteen multiscale atomistic/continuum coupling methods. Model Simul Mater Sci
- Eng 2009;17:053001.[35] Fish J. Bridging the scales in nano engineering and science. J Nanopart Res 2006;8:577–94.
- [36] Vvedensky DD. Multiscale modelling of nanostructures. J Phys: Condens Matter 2004;16:R1537.
- [37] Ghoniem NM, Busso EP, Kioussis N, Huang H. Multiscale modelling of nanomechanics and micromechanics: an overview. Philos Mag 2003;83:3475-528.
- [38] Miller RE, Tadmor EB. Hybrid continuum mechanics and atomistic methods for simulating materials deformation and failure. MRS Bull 2007;32:920-6.
- [39] Elliott J. Novel approaches to multiscale modelling in materials science. Int Mater Rev 2011;56:207-25.
- [40] Jin J, Shevlin S, Guo Z. Multiscale simulation of onset plasticity during nanoindentation of Al (001) surface. Acta Mater 2008;56:4358-68.
- [41] Miller RE, Shilkrot L, Curtin WA. A coupled atomistics and discrete dislocation plasticity simulation of nanoindentation into single crystal thin films. Acta Mater 2004;52:271–84.
- [42] Zeng F-L, Sun Y, Liu Y-Z, Zhou Y. Multiscale simulations of wedged nanoindentation on nickel. Comput Mater Sci 2012;62:47–54.
- [43] Zhu P, Hu Y, Fang F, Wang H. Multiscale simulations of nanoindentation and nanoscratch of single crystal copper. Appl Surf Sci 2012;258:4624–31.
  [44] Alizadeh O, Eshlaghi GT, Mohammadi S. Nanoindentation simulation of coated aluminum thin film using quasicontinuum method. Comput Mater Sci 2016:111:12–22.
- [45] Zeng F, Zhao B, Sun Y. Multiscale simulation of incipient plasticity and dislocation nucleation on nickel film during tilted flat-ended nanoindentation. Acta Mech Solida Sin 2015;28:484–96.
- [46] Fanlin Z, Yi S. Quasicontinuum simulation of nanoindentation of nickel film. Acta Mech Solida Sin 2006;19:283-8.
- [47] Shan D, Wang L, Yuan L. Effect of the  $\Sigma$  5 (310)/[001]  $\theta$  = 53.1° grain boundary on the incipient yield of bicrystal copper: a quasicontinuum simulation and nanoindentation experiment. J Mater Res 2013:28:766–73.
- [48] Su Z, Tan V, Tay T. Concurrent multiscale modeling of amorphous materials in 3D. Int J Numer Meth Eng 2012;92:1081–99.
- [49] Zhu A, He D, He R, Zou C. Nanoindentation simulation on single crystal copper by quasi-continuum method. Mater Sci Eng A 2016;674:76-81.
- [50] Fang T-H, Chang W-J, Yu D-J, Huang C-C. Microscopic properties of a nanocrystal aluminum thin film during nanoimprint using quasi-continuous method. Thin Solid Films 2016;612:237–42.
- [51] Zhang Z, Ni Y. Multiscale analysis of delay effect of dislocation nucleation with surface pit defect in nanoindentation. Comput Mater Sci 2012;62:203–9.
   [52] Lu H, Ni Y, Mei J, Li J, Wang H. Anisotropic plastic deformation beneath surface step during nanoindentation of FCC Al by multiscale analysis. Comput Mater Sci 2012;58:192–200.
- [53] Li J, Lu H, Ni Y, Mei J. Quasicontinuum study the influence of misfit dislocation interactions on nanoindentation. Comput Mater Sci 2011;50:3162-70.
- [54] Lu H, Li J, Ni Y. Position effect of cylindrical indenter on nanoindentation into Cu thin film by multiscale analysis. Comput Mater Sci 2011;50:2987–92.
- [55] Shao Y, Zhao X, Li J, Wang S. Multiscale simulations on the reversible plasticity of Al (001) surface under a nano-sized indenter. Comput Mater Sci 2013;67:346-52.
- [56] Yu W, Shen S. Initial dislocation topologies of nanoindentation into copper (001) film with a nanocavity. Eng Fract Mech 2010;77:3329-40.
- [57] Li J, Mei J, Ni Y, Lu H, Jiang W. Two-dimensional quasicontinuum analysis of the strengthening and weakening effect of Cu/Ag interface on nanoindentation. J Appl Phys 2010;108:054309.
- [58] Yu W, Shen S. Effects of small indenter size and its position on incipient yield loading during nanoindentation. Mater Sci Eng A 2009;526:211-8.
- [59] Yu W, Shen S. Multiscale analysis of the effects of nanocavity on nanoindentation. Comput Mater Sci 2009;46:425–30.
- [60] Iglesias RA, Leiva EP. Two-grain nanoindentation using the quasicontinuum method: two-dimensional model approach. Acta Mater 2006;54:2655-64.
- [61] Wei X, Kysar JW. Experimental validation of multiscale modeling of indentation of suspended circular graphene membranes. Int J Solids Struct 2012:49:3201–9.
- [62] Van Vliet KJ, Li J, Zhu T, Yip S, Suresh S. Quantifying the early stages of plasticity through nanoscale experiments and simulations. Phys Rev B 2003;67:104105.
- [63] Zhong Y, Zhu T. Simulating nanoindentation and predicting dislocation nucleation using interatomic potential finite element method. Comput Methods Appl Mech Eng 2008;197:3174–81.
- [64] Xu S, Chen X. Modeling dislocations and heat conduction in crystalline materials: atomistic/continuum coupling approaches. Int Mater Rev 2018. https://doi. org/10.1080/09506608.2018.1486358. in press.
- [65] Shiari B, Miller RE, Curtin WA. Coupled atomistic/discrete dislocation simulations of nanoindentation at finite temperature. J Eng Mater Technol 2005;127:358–68.
- [66] Xiong L, Tucker G, McDowell DL, Chen Y. Coarse-grained atomistic simulation of dislocations. J Mech Phys Solids 2011;59:160-77.
- [67] Xiong L, Deng Q, Tucker G, McDowell DL, Chen Y. A concurrent scheme for passing dislocations from atomistic to continuum domains. Acta Mater 2012:60:899–913.
- [68] Xu S, Xiong L, Deng Q, McDowell DL. Mesh refinement schemes for the concurrent atomistic-continuum method. Int J Solids Struct 2016;90:144–52.
- [69] Curtin WA, Miller RE. A perspective on atomistic-continuum multiscale modeling. Model Simul Mater Sci Eng 2017;25:071004.
- [70] Ren G, Zhang D, Gong X-G. Dynamical coupling atomistic and continuum simulations. Comm Comput Phys 2011;10:1305-14.
- [71] Ren G, Zhang D, Gong X. Dynamical multiscale simulation of nanoindentation. Phys Lett A 2011;375:953-6.
- [72] Iacobellis V, Behdinan K. Multiscale coupling using a finite element framework at finite temperature. Int J Numer Meth Eng 2012;92:652–70.
- [73] Jacobellis V, Behdinan K. Bridging cell multiscale modeling of fatigue crack growth in fcc crystals. Int J Numer Meth Eng 2015;104:1200-16.
- [74] Zamani SMM, Iacobellis V, Behdinan K. Multiscale modeling of the nanodefects and temperature effect on the mechanical response of sapphire. J Am Ceram Soc 2016;99:2458–66.
- [75] Iacobellis V. A bridging cell multiscale methodology to model the structural behaviour of polymer matrix composites. University of Toronto; 2016.
- [76] Liu B, Jiang H, Huang Y, Qu S, Yu M-F, Hwang K. Atomic-scale finite element method in multiscale computation with applications to carbon nanotubes. Phys Rev B 2005;72:035435.
- [77] Liu B, Huang Y, Jiang H, Qu S, Hwang K. The atomic-scale finite element method. Comput Methods Appl Mech Eng 2004;193:1849-64.
- [78] Subramaniyan AK, Sun C. Engineering molecular mechanics: an efficient static high temperature molecular simulation technique. Nanotechnology. 2008;19:285706.
- [79] Iacobellis V, Behdinan K. Bridging cell multiscale modeling of nanoindentation at finite temperature. Trans Control Mech Syst 2013;2.
- [80] Chen Y, Zimmerman J, Krivtsov A, McDowell DL. Assessment of atomistic coarse-graining methods. Int J Eng Sci 2011;49:1337–49.
- [81] Chen Y. Reformulation of microscopic balance equations for multiscale materials modeling. J Chem Phys 2009;130:134706.
- [82] Xu S, Xiong L, Chen Y, McDowell DL. An analysis of key characteristics of the Frank-Read source process in FCC metals. J Mech Phys Solids 2016;96:460–76.
   [83] Xu S, Payne TG, Chen H, Liu Y, Xiong L, Chen Y, et al. PyCAC: the concurrent atomistic-continuum simulation environment. J Mater Res 2018;33:857–71.
- [84] Xu S, Che R, Xiong L, Chen Y, McDowell DL. A quasistatic implementation of the concurrent atomistic-continuum method for FCC crystals. Int J Plast
- 2015:72:91-126.
- [85] Yang S, Xiong L, Deng Q, Chen Y. Concurrent atomistic and continuum simulation of strontium titanate. Acta Mater 2013;61:89–102.
- [86] Shilkrot L, Miller R, Curtin W. Coupled atomistic and discrete dislocation plasticity. Phys Rev Lett 2002;89:025501.

- [87] Shilkrot L, Miller RE, Curtin WA. Multiscale plasticity modeling: coupled atomistics and discrete dislocation mechanics. J Mech Phys Solids 2004;52:755–87.[88] Cho J, Junge T, Molinari J-F, Anciaux G. Toward a 3D coupled atomistic and discrete dislocation dynamics simulation: dislocation core structures and Peierls
- stresses with several character angles in FCC aluminum. Adv Model Simul Eng Sci 2015;2:12. [89] Cho J, Molinari J-F, Anciaux G. Mobility law of dislocations with several character angles and temperatures in FCC aluminum. Int J Plast 2017;90:66–75.
- [90] Pavia F, Curtin W. Parallel algorithm for multiscale atomistic/continuum simulations using LAMMPS. Model Simul Mater Sci Eng 2015;23:055002.

[91] Anciaux G, Junge T, Hodapp M, Cho J, Molinari J-F, Curtin W. The coupled atomistic/discrete-dislocation method in 3d Part I: concept and algorithms. J Mech

- Phys Solids 2018;118:152–71.
  [92] Cho J, Molinari J-F, Curtin WA, Anciaux G. The coupled atomistic/discrete-dislocation method in 3d. Part III: dynamics of hybrid dislocations. J Mech Phys Solids 2018:118:1–14.
- [93] Hodapp M, Anciaux G, Molinari J-F, Curtin W. Coupled atomistic/discrete dislocation method in 3D Part II: validation of the method. J Mech Phys Solids 2018;119:1–19.
- [94] Qu S, Shastry V, Curtin W, Miller R. A finite-temperature dynamic coupled atomistic/discrete dislocation method. Model Simul Mater Sci Eng 2005;13:1101. [95] Shiari B, Miller RE. Multiscale modeling of crack initiation and propagation at the nanoscale. J Mech Phys Solids 2016;88:35–49.
- [96] Shiari B, Miller RE, Klug DD. Multiscale simulation of material removal processes at the nanoscale. J Mech Phys Solids 2007;55:2384–405.
- [97] Lidorikis E, Bachlechner ME, Kalia RK, Nakano A, Vashishta P, Voyiadjis GZ. Coupling length scales for multiscale atomistics-continuum simulations: atomistically induced stress distributions in Si/Si<sub>3</sub>N<sub>4</sub> nanopixels. Phys Rev Lett 2001;87:086104.
- [98] Broughton JQ, Abraham FF, Bernstein N, Kaxiras E. Concurrent coupling of length scales: methodology and application. Phys Rev B 1999;60:2391.
- [99] Rudd RE, Broughton JQ. Concurrent coupling of length scales in solid state systems. Phys Status Solidi (b) 2000;217:251–91.
- [100] Ogata S, Lidorikis E, Shimojo F, Nakano A, Vashishta P, Kalia RK. Hybrid finite-element/molecular-dynamics/electronic-density-functional approach to materials simulations on parallel computers. Comput Phys Commun 2001;138:143–54.
- [101] Wang C-T, Jian S-R, Jang JS-C, Lai Y-S, Yang P-F. Multiscale simulation of nanoindentation on Ni (100) thin film. Appl Surf Sci 2008;255:3240-50.
- [102] Tadmor EB, Ortiz M, Phillips R. Quasicontinuum analysis of defects in solids. Philos Mag A 1996;73:1529–63.
- [103] Tadmor E, Legoll F, Kim W, Dupuy L, Miller R. Finite-temperature quasi-continuum. Appl Mech Rev 2013;65:010803.
- [104] Dupuy LM, Tadmor EB, Miller RE, Phillips R. Finite-temperature quasicontinuum: molecular dynamics without all the atoms. Phys Rev Lett 2005;95:060202.
- [105] Li S, Liu WK, Rosakis AJ, Belytschko T, Hao W. Mesh-free Galerkin simulations of dynamic shear band propagation and failure mode transition. Int J Solids Struct 2002;39:1213–40.
- [106] Li H, Ng T, Cheng J, Lam K. Hermite-Cloud: a novel true meshless method. Comput Mech 2003;33:30-41.
- [107] Liu WK, Jun S, Zhang YF. Reproducing kernel particle methods. Int J Numer Meth Fluids 1995;20:1081–106.
- [108] Quarteroni A, Valli A. Domain decomposition methods for partial differential equations. Oxford University Press; 1999.
- [109] Ng T, Pandurangan V, Li H. Multiscale modeling of nanoindentation in copper thin films via the concurrent coupling of the meshless Hermite-Cloud method with molecular dynamics. Appl Surf Sci 2011;257:10613–20.
- [110] Pandurangan V, Ng T, Li H. Nanoscratch simulation on a copper thin film using a novel multiscale model. J Nanomech Micromech 2013;4:A4013008.
   [111] Xiao S, Yang W. A temperature-related homogenization technique and its implementation in the meshfree particle method for nanoscale simulations. Int J Numer Meth Eng 2007;69:2099–125.
- [112] Belytschko T, Lu YY, Gu L. Element-free Galerkin methods. Int J Numer Meth Eng 1994;37:229-56.
- [113] Dyka C, Randles P, Ingel R. Stress points for tension instability in SPH. Int J Numer Meth Eng 1997;40:2325-41.
- [114] Bardenhagen S, Kober E. The generalized interpolation material point method. Comput Model Eng Sci 2004;5:477-96.
- [115] Ma J. Multiscale simulation using the generalized interpolation material point method, discrete dislocations and molecular dynamics. Oklahoma State University; 2006.
- [116] Harlow FH. The particle-in-cell computing method for fluid dynamics. Methods Comput Phys 1964;3:319-43.
- [117] Sulsky D, Chen Z, Schreyer HL. A particle method for history-dependent materials. Comput Methods Appl Mech Eng 1994;118:179-96.
- [118] Sulsky D, Zhou S-J, Schreyer HL. Application of a particle-in-cell method to solid mechanics. Comput Phys Commun 1995;87:236-52.
- [119] Sadeghirad A, Brannon RM, Burghardt J. A convected particle domain interpolation technique to extend applicability of the material point method for problems involving massive deformations. Int J Numer Meth Eng 2011;86:1435–56.
- [120] Van der Giessen E, Needleman A. Discrete dislocation plasticity: a simple planar model. Model Simul Mater Sci Eng 1995;3:689.
- [121] Ma J, Liu Y, Lu H, Komanduri R. Multiscale simulation of nanoindentation using the generalized interpolation material point (GIMP) method, dislocation dynamics (DD) and molecular dynamics (MD). Comput Model Eng Sci 2006;16:41.
- [122] Yang Q, Biyikli E, To AC. Multiresolution molecular mechanics: statics. Comput Methods Appl Mech Eng 2013;258:26–38.
- [123] Biyikli E, Yang Q, To AC. Multiresolution molecular mechanics: dynamics. Comput Methods Appl Mech Eng 2014;274:42–55.
- [124] Yang O, Biyikli E, To AC. Multiresolution molecular mechanics: Convergence and error structure analysis. Comput Methods Appl Mech Eng 2014;269:20-45.
- [125] Yang Q, To AC. Multiresolution molecular mechanics: a unified and consistent framework for general finite element shape functions. Comput Methods Appl Mech Eng 2015;283:384–418.
- [126] Biyikli E, To AC. Multiresolution molecular mechanics: adaptive analysis. Comput Methods Appl Mech Eng 2016;305:682–702.
- [127] Biyikli E, To AC. Multiresolution molecular mechanics: Implementation and efficiency. J Comput Phys 2017;328:27-45.
- [128] Yang Q, To AC. Multiresolution molecular mechanics: surface effects in nanoscale materials. J Comput Phys 2017;336:212-34.
- [129] Zhu P, Hu Y, Wang H. A hybrid model for multiscale simulations of nanoindentation. Proc Inst Mech Eng, Part J: J Eng Tribol 2011;225:845–53.
- [130] Luan B, Hyun S, Molinari J, Bernstein N, Robbins MO. Multiscale modeling of two-dimensional contacts. Phys Rev E 2006;74:046710.
- [131] Luan B, Robbins MO. Hybrid atomistic/continuum study of contact and friction between rough solids. Tribol Lett 2009;36:1-16.
- [132] McGee E, Smith R, Kenny S. Multiscale modelling of nanoindentation. Int J Mater Res 2007;98:430-7.
- [133] Richter A, Chen C-L, Smith R, McGee E, Thomson R, Kenny S. Hot stage nanoindentation in multi-component Al–Ni–Si alloys: experiment and simulation. Mater Sci Eng A 2008;494:367–79.
- [134] Chavoshi SZ, Xu S, Goel S. Addressing the discrepancy of finding the equilibrium melting point of silicon using molecular dynamics simulations. Proc R Soc A 2017;473:20170084.
- [135] Xu S, Chavoshi SZ. Uniaxial deformation of nanotwinned nanotubes in body-centered cubic tungsten. Curr Appl Phys 2018;18:114–21.
- [136] Xu S, Su Y, Chavoshi SZ. Deformation of periodic nanovoid structures in Mg single crystals. Mater Res Express 2018;5:016523.
- [137] Chavoshi SZ, Gallo SC, Dong H, Luo X. High temperature nanoscratching of single crystal silicon under reduced oxygen condition. Mater Sci Eng A 2017;684:385–93.
- [138] Xu S, Su Y. Dislocation nucleation from symmetric tilt grain boundaries in body-centered cubic vanadium. Phys Lett A 2018;382:1185-9.
- [139] Xu S, Xiong L, Chen Y, McDowell DL. Comparing EAM potentials to model slip transfer of sequential mixed character dislocations across two symmetric tilt grain boundaries in Ni. JOM 2017;69:814–21.
- [140] Xu S, Startt JK, Payne TG, Deo CS, McDowell DL. Size-dependent plastic deformation of twinned nanopillars in body-centered cubic tungsten. J Appl Phys 2017;121:175101.
- [141] Becker CA, Tavazza F, Trautt ZT, de Macedo RAB. Considerations for choosing and using force fields and interatomic potentials in materials science and engineering. Curr Opin Solid State Mater Sci 2013;17:277–83.
- [142] Brenner D. The art and science of an analytic potential. Phys Status Solidi (b) 2000;217:23-40.
- [143] Martinez JA, Yilmaz DE, Liang T, Sinnott SB, Phillpot SR. Fitting empirical potentials: challenges and methodologies. Curr Opin Solid State Mater Sci 2013;17:263–70.
- [144] Gale JD. Empirical potential derivation for ionic materials. Philos Mag B 1996;73:3–19.
- [145] Gale JD. GULP: a computer program for the symmetry-adapted simulation of solids. J Chem Soc, Faraday Trans 1997;93:629–37.

- [146] Gale JD, Rohl AL. The general utility lattice program (GULP). Mol Simul 2003;29:291-341.
- [147] Adams BM, Bauman LE, Bohnhoff WJ, Dalbey KR, Eddy JP, Ebeida MS, Dakota, a multilevel parallel object-oriented framework for design optimization, parameter estimation, uncertainty quantification, and sensitivity analysis. Tech. rep., Sandia National Laboratories; 2014.
- [148] Martinez JA, Chernatynskiy A, Yilmaz DE, Liang T, Sinnott SB, Phillpot SR. Potential optimization software for materials (POSMat). Comput Phys Commun 2016:203:201-11.
- [149] Wen M, Whalen S, Elliott R, Tadmor E. Interpolation effects in tabulated interatomic potentials. Model Simul Mater Sci Eng 2015;23:074008.
- [150] Daw MS, Baskes MI. Embedded-atom method: derivation and application to impurities, surfaces, and other defects in metals. Phys Rev B 1984;29:6443–53.
   [151] Angelo JE, Moody NR, Baskes MI. Trapping of hydrogen to lattice defects in nickel. Model Simul Mater Sci Eng 1995;3:289.
- [152] Brenner DW. Empirical potential for hydrocarbons for use in simulating the chemical vapor deposition of diamond films. Phys Rev B 1990;42:9458-71.
- [153] Brenner DW. Erratum: Empirical potential for hydrocarbons for use in simulating the chemical vapor deposition of diamond films. Phys Rev B 1992;46:1948.
- [154] Grochola G, Russo SP, Snook IK. On fitting a gold embedded atom method potential using the force matching method. J Chem Phys 2005;123:204719.
- [155] Roy S, Mordehai D. Annihilation of edge dislocation loops via climb during nanoindentation. Acta Mater 2017;127:351-8.
- [156] Chavoshi SZ, Xu S. Twinning effects in the single/nanocrystalline cubic silicon carbide subjected to nanoindentation loading. Materialia; 2018. http://doi.org./ 10.1016/j.mtla.2018.09.003.
- [157] Amaya-Roncancio S, Arias-Mateus D, Gomez-Hermida M, Riano-Rojas J, Restrepo-Parra E. Molecular dynamics simulations of the temperature effect in the hardness on Cr and CrN films. Appl Surf Sci 2012;258:4473–7.
- [158] Komanduri R, Chandrasekaran N, Raff L. Molecular dynamics (MD) simulation of uniaxial tension of some single-crystal cubic metals at nanolevel. Int J Mech Sci 2001;43:2237–60.
- [159] Xiong K, Lu H, Gu J. Atomistic simulations of the nanoindentation-induced incipient plasticity in Ni<sub>3</sub>Al crystal. Comput Mater Sci 2016;115:214–26.
- [160] Du J, Wang C, Yu T. Construction and application of multi-element EAM potential (Ni–Al–Re) in γ/γ' Ni-based single crystal superalloys. Model Simul Mater Sci Eng 2013;21:015007.
- [161] Liu H, Chen K, Gong Y, An G, Hu Z. Properties of the liquid-vapour interface of fcc metals calculated using the tight-binding potential. Philos Mag A 1997;75:1067–74.
- [162] Maekawa K, Itoh A. Friction and tool wear in nano-scale machining—a molecular dynamics approach. Wear 1995;188:115–22.
- [163] Fang T-H, Weng C-I, Chang J-G. Molecular dynamics analysis of temperature effects on nanoindentation measurement. Mater Sci Eng A 2003;357:7-12.
- [164] Liu C-L, Fang T-H, Lin J-F. Atomistic simulations of hard and soft films under nanoindentation. Mater Sci Eng A 2007;452:135–41.
- [165] Hsieh J-Y, Ju S-P, Li S-H, Hwang C-C. Temperature dependence in nanoindentation of a metal substrate by a diamondlike tip. Phys Rev B 2004;70:195424–33.
- [166] Liu D, Tsai C, Lyu S. Determination of temperature-dependent elasto-plastic properties of thin-film by MD nanoindentation simulations and an inverse GA/FEM computational scheme. Comput Mater Continua 2009;11:147.
- [167] Cleri F, Rosato V. Tight-binding potentials for transition metals and alloys. Phys Rev B 1993;48:22.
- [168] Vashishta P, Kalia RK, Nakano A, Rino JP. Interaction potential for silicon carbide: a molecular dynamics study of elastic constants and vibrational density of states for crystalline and amorphous silicon carbide. J Appl Phys 2007;101:103515–28.
- [169] Fang T-H, Wu J-H. Molecular dynamics simulations on nanoindentation mechanisms of multilayered films. Comput Mater Sci 2008;43:785–90.
- [170] Papanicolaou N, Chamati H, Evangelakis G, Papaconstantopoulos D. Second-moment interatomic potential for Al, Ni and Ni–Al alloys, and molecular dynamics application. Comput Mater Sci 2003;27:191–8.
- [171] Wu C-D, Fang T-Ĥ, Chan C-Y. A molecular dynamics simulation of the mechanical characteristics of a C<sub>60</sub>-filled carbon nanotube under nanoindentation using various carbon nanotube tips. Carbon 2011;49:2053–61.
- [172] Tersoff J. Modeling solid-state chemistry: Interatomic potentials for multicomponent systems. Phys Rev B 1989;39:5566-8.
- [173] Tersoff J. Erratum: Modeling solid-state chemistry: interatomic potentials for multicomponent systems. Phys Rev B 1990;41. 3248-3248.
- [174] Tersoff J. Empirical interatomic potential for silicon with improved elastic properties. Phys Rev B 1988;38:9902–5.
- [175] Tersoff J. New empirical approach for the structure and energy of covalent systems. Phys Rev B 1988;37:6991–7000.
- [176] Huang C, Peng X, Fu T, Zhao Y, Feng C, Lin Z, et al. Nanoindentation of ultra-hard cBN films: a molecular dynamics study. Appl Surf Sci 2017;392:215–24.
- [177] Jiang J-W, Park HS, Rabczuk T. Molecular dynamics simulations of single-layer molybdenum disulphide (MoS2): Stillinger-Weber parametrization, mechanical properties, and thermal conductivity. J Appl Phys 2013;114:064307.
- [178] Liang T, Phillpot SR, Sinnott SB. Parametrization of a reactive many-body potential for Mo-S systems. Phys Rev B 2009;79:245110.
- [179] Zhao J, Jiang J-W, Rabczuk T. Temperature-dependent mechanical properties of single-layer molybdenum disulphide: molecular dynamics nanoindentation simulations. Appl Phys Lett 2013;103:231913.
- [180] Wang W, Li L, Yang C, Soler-Crespo R, Meng Z, Li M, et al. Plasticity resulted from phase transformation for monolayer molybdenum disulfide film during nanoindentation simulations. Nanotechnology 2017;28:164005.
- [181] Delogu F. A molecular dynamics study on the role of localised lattice distortions in the formation of Ni-Zr metallic glasses. Mater Sci Eng A 2003;359:52-61.
- [182] Wang C-H, Chao K-C, Fang T-H, Stachiv I, Hsieh S-F. Investigations of the mechanical properties of nanoimprinted amorphous Ni–Zr alloys utilizing the molecular dynamics simulation. J Alloys Compd 2016;659:224–31.
- [183] Argon A. Plastic deformation in metallic glasses. Acta Metall 1979;27:47–58.
- [184] Argon A, Shi LT. Development of visco-plastic deformation in metallic glasses. Acta Metall 1983;31:499-507.
- [185] Zallen R. The physics of amorphous solids. John Wiley & Sons; 2008.
- [186] Qiu C, Zhu P, Fang F, Yuan D, Shen X. Study of nanoindentation behavior of amorphous alloy using molecular dynamics. Appl Surf Sci 2014;305:101–10.
- [187] Mendelev M, Kramer M, Ott R, Sordelet D, Yagodin D, Popel P. Development of suitable interatomic potentials for simulation of liquid and amorphous Cu-Zr alloys. Philos Mag 2009;89:967–87.
- [188] Wang C-H, Fang T-H, Cheng P-C, Chiang C-C, Chao K-C. Simulation and experimental analysis of nanoindentation and mechanical properties of amorphous NiAl alloys. J Mol Model 2015;21:161.
- [189] Wang WH. The elastic properties, elastic models and elastic perspectives of metallic glasses. Prog Mater Sci 2012;57:487-656.
- [190] Mishin Y, Mehl M, Papaconstantopoulos D, Voter A, Kress J. Structural stability and lattice defects in copper: ab initio, tight-binding, and embedded-atom calculations. Phys Rev B 2001;63:224106.
- [191] Inamura T, Takezawa N, Taniguchi N. Atomic-scale cutting in a computer using crystal models of copper and diamond. CIRP Ann-Manuf Technol 1992;41:121–4.
- [192] Pandurangan V, Li H, Ng T. A concurrent multiscale method based on the alternating Schwarz scheme for coupling atomic and continuum scales with first-order compatibility. Comput Mech 2011;47:1–16.
- [193] Pen H, Liang Y, Luo X, Bai Q, Goel S, Ritchie J. Multiscale simulation of nanometric cutting of single crystal copper and its experimental validation. Comput Mater Sci 2011;50:3431–41.
- [194] Sun X, Chen S, Cheng K, Huo D, Chu W. Multiscale simulation on nanometric cutting of single crystal copper. Proc Inst Mech Eng, Part B: J Eng Manuf 2006;220:1217–22.
- [195] Sun X, Cheng K. Multi-scale simulation of the nano-metric cutting process. Int J Adv Manuf Technol 2010;47:891–901.
- [196] Zhang L, Zhao H, Guo W, Ma Z, Wang X. Quasicontinuum analysis of the effect of tool geometry on nanometric cutting of single crystal copper. Optik-Int J Light Electron Opt 2014;125:682–7.
- [197] Fang C, Meng X, Xie Y, Zhao B. Quasicontinuum investigation of the feedback effects on friction behavior of an abrasive particle over a single crystal aluminum substrate. Tribol Int 2016;98:48–58.
- [198] Wang J-S, Zhang X-D, Chen X-W, Lai M, Xu F-F. Effect of crystal orientations on nanocutting based on quasicontinuum multiscale method. Int J Nanomanuf 2014;10:371–89.
- [199] Chavoshi SZ, Goel S, Luo X. Molecular dynamics simulation investigation on the plastic flow behaviour of silicon during nanometric cutting. Model Simul Mater

Sci Eng 2015;24:015002.

- [200] Chavoshi SZ, Luo X. Atomic-scale characterization of occurring phenomena during hot nanometric cutting of single crystal 3C-SiC. RSC Adv 2016;6:71409–24.
   [201] Chavoshi SZ, Luo X. An atomistic simulation investigation on chip related phenomena in nanometric cutting of single crystal silicon at elevated temperatures.
- Comput Mater Sci 2016;113:1–10.
- [202] Chavoshi SZ, Goel S, Luo X. Influence of temperature on the anisotropic cutting behaviour of single crystal silicon: a molecular dynamics simulation investigation. J Manuf Processes 2016;23:201–10.
- [203] Wu C-D, Fang T-H, Su J-K. Nanometric mechanical cutting of metallic glass investigated using atomistic simulation. Appl Surf Sci 2017;396:319-26.
- [204] Stillinger FH, Weber TA. Computer simulation of local order in condensed phases of silicon. Phys Rev B 1985;31:5262-71.
- [205] Erhart P, Albe K. Analytical potential for atomistic simulations of silicon, carbon, and silicon carbide. Phys Rev B 2005;71:035211-25.
- [206] Chavoshi SZ, Luo X. Molecular dynamics simulation study of deformation mechanisms in 3C–SiC during nanometric cutting at elevated temperatures. Mater Sci Eng A 2016;654:400–17.
- [207] Pun GP, Mishin Y. Optimized interatomic potential for silicon and its application to thermal stability of silicene. Phys Rev B 2017;95:224103.
- [208] Coleman S, Spearot D, Capolungo L. Virtual diffraction analysis of Ni [010] symmetric tilt grain boundaries. Model Simul Mater Sci Eng 2013;21:055020-36.
- [209] Chavoshi SZ, Xu S, Luo X. Dislocation-mediated plasticity in silicon during nanometric cutting: a molecular dynamics simulation study. Mater Sci Semicond Process 2016;51:60–70.
- [210] Zykova-Timan T, Ceresoli D, Tosatti E. Peak effect versus skating in high-temperature nanofriction. Nat Mater 2007;6:230-4.
- [211] Fumi FG, Tosi M. Ionic sizes and born repulsive parameters in the NaCl-type alkali halides—I: the Huggins-Mayer and Pauling forms. J Phys Chem Solids 1964;25:31-43.
- [212] Tosi M, Fumi F. Ionic sizes and born repulsive parameters in the NaCl-type alkali halides—II: the generalized Huggins-Mayer form. J Phys Chem Solids 1964;25:45–52.
- [213] Meyer E, Gnecco E. Nanofriction: skating on hot surfaces. Nat Mater 2007;6:180-1.
- [214] Crawford R, Taylor J, Keefer D. Solid ring armature experiments in a transaugmented railgun. IEEE Trans Magn 1995;31:138-43.
- [215] Drobyshevski E, Kolesnikova E, Yuferev V. Calculating the liquid film effect on solid armature rail-gun launching. IEEE Trans Magn 1999;35:53–8.
- [216] He B, Ghosh G, Chung Y-W, Wang Q. Effect of melting and microstructure on the microscale friction of silver-bismuth alloys. Tribol Lett 2010;38:275-82.
- [217] Mizushima K, Yip S, Kaxiras E. Ideal crystal stability and pressure-induced phase transition in silicon. Phys Rev B 1994;50:14952.
- [218] Voter AF. Parallel replica method for dynamics of infrequent events. Phys Rev B 1998;57:R13985.
- [219] So/rensen MR, Voter AF. Temperature-accelerated dynamics for simulation of infrequent events. J Chem Phys 2000;112:9599-606.
- [220] Roters F, Eisenlohr P, Bieler TR, Raabe D. Crystal plasticity finite element methods: in materials science and engineering. John Wiley & Sons; 2011.
- [221] Roters F, Eisenlohr P, Hantcherli L, Tjahjanto DD, Bieler TR, Raabe D. Overview of constitutive laws, kinematics, homogenization and multiscale methods in crystal plasticity finite-element modeling: theory, experiments, applications. Acta Mater 2010;58:1152–211.
- [222] Faghihi D, Voyiadjis GZ. Determination of nanoindentation size effects and variable material intrinsic length scale for body-centered cubic metals. Mech Mater 2012;44:189–211.
- [223] Yang Q, Biyikli E, Zhang P, Tian R, To AC. Atom collocation method. Comput Methods Appl Mech Eng 2012;237:67–77.
- [224] Gracie R, Belytschko T. Concurrently coupled atomistic and XFEM models for dislocations and cracks. Int J Numer Meth Eng 2009;78:354-78.
- [225] Gracie R, Belytschko T. An adaptive concurrent multiscale method for the dynamic simulation of dislocations. Int J Numer Meth Eng 2011;86:575-97.
- [226] Agrawal R, Espinosa H. Multiscale experiments: state of the art and remaining challenges. J Eng Mater Technol 2009;131:041208.
- [227] Behler J. Perspective: machine learning potentials for atomistic simulations. J Chem Phys 2016;145(17):170901.