# Thermal wave: from nonlocal continuum to molecular dynamics†

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It is well known that the continuum model of Fourier's law of heat conduction violates the relativity theory, admits an instantaneous thermal response, and assumes a quasi-equilibrium thermodynamic condition. Transient heat transport, however, is a non-equilibrium phenomenon with a finite thermal wave speed for applications involving very low temperatures, extremely high temperature gradients, and ballistic heat transfers. Hyperbolic and phase-lag heat conduction models have enabled detection of the finite thermal wave speed in heat transport. To accommodate effects of thermomass and size-dependency of thermophysical properties on nano/microscale heat transport and to remove the theoretical singularity of temperature gradients across the thermal wavefront, a nonlocal, fractional-order, three-phase-lag heat conduction is introduced. The model is capable of simulating heat conduction phenomena in multiple spatio-temporal scales. To confirm the existence of thermal waves in nano/microscale heat transport, a molecular dynamics simulation is implemented for the heat transfer within a nanoscale copper slab. Correlating thermal responses in continuum and atomistic scales sheds light on the effect of length scale, fractional order, and phase-lags in multiscale heat transport. The multiscale simulation is of practical importance for microelectromechanical system design, photothermal techniques, and ultrafast laser-assisted processing of advanced materials.

## 1. Introduction

Advances in ultrafast laser-assisted manufacturing technology have enabled the fabrication of miniaturized nano/microscale devices for electronics, optics, medicine, and energy applications. Electrons and lattices, however, are not in an equilibrium state during ultrafast laser processing of metals. A non-equilibrium heat transfer model is required instead of the classical phenomenological Fourier heat conduction to evaluate the temperature rise during laser-assisted manufacturing.[1,2] Laser material processing has also opened a new horizon for developing ultralight architected materials with unprecedented multifunctional properties in multiple scales (nano/micro to macro) for heat exchanging, thermal insulating, shock damping, and current collecting.[3–6] Due to the broad range of applications of these types of advanced architected materials, the advanced materials could experience very low temperature or extremely high temperature gradients for which a precise heat transport model should be considered to capture temperature rise from thermal wave propagation.[7,8] In

addition, novel technologies like dip-in 3D direct-laser-writing optical lithography are capable of manufacturing nano/micro-architected materials in which physical properties (*e.g.* elastic modulus, thermal conductivity, and electrical permeability) become size-dependent, particularly for nanoscale materials.[9,10] The interaction of energy carriers with domain boundaries for nanoscale devices is more pronounced than macroscale devices, leading to a lower thermal conductivity compared to the bulk value.[9,11,12] This fact implies the necessity of applying a nonlocal heat transfer model for nano-devices to accommodate the contribution of thermomass and phonon scattering in heat transport. Nanomaterials with characteristic length and time comparable to the phonon mean free path and phonon relaxation time reveal phonon propagation in a wave form and not in a diffusive form found in conventional heat transport phenomena;[13,14] for instance, Monte Carlo simulation has shown the thermal wave in phonon ballistic transport regime for nanofilms and graphene sheets.[15,16] To better comprehend the simulation methodologies for thermal wave propagation, we first review alternative continuum heat conduction models and then introduce a new heat transport analysis through the molecular dynamics (MD) simulation.

The earliest heat conduction model is the empirical Fourier's law,[17] which assumes the following linear relation between heat flux ($\vec{q}$) and temperature gradient ($\vec{\nabla}T$) through thermal conductivity ($k$):

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† Electronic supplementary information (ESI) available. See DOI: 10.1039/c6ra28831f

$$\vec{q}(\vec{x}, t) = k\vec{\nabla}T(\vec{x}, t) \tag{1}$$

Because of the simplicity of Fourier's law, it has been widely used for a broad range of engineering applications. Nonetheless, Fourier's law results in a parabolic-type heat conduction equation with an infinite speed for the conductive heat transport, which contradicts the relativity theory.[18] In reality, the applicability of Fourier's law for ultra-small spatial and temporal heat transport is controversial;[19] experiments have reported the violation of nano/microscale heat conduction from Fourier's law. To eradicate this contradiction, Cattaneo and Vernotte (C–V)[20,21] presented the first non-Fourier heat conduction theory by introducing thermal relaxation time ($\tau_{CV}$):

$$\left(1 + \tau_{CV}\frac{\partial}{\partial t}\right)\vec{q}(\vec{x}, t) = -k\vec{\nabla}T(\vec{x}, t) \tag{2}$$

The C–V model leads to a hyperbolic-type heat conduction equation that predicts the experimentally proven thermal wave in heat transport. The model, however, lacks a physical basis, violates the second-law of thermodynamics, and cannot accurately describe the experimental data of heat transport.[22–24] In addition, the C–V model of heat conduction overlooks the effects of microstructure on the heat transport process. To consider the non-equilibrium thermodynamics process of heat transport during the ultrafast laser heating and micro-macro interactions of heat carriers, a hyperbolic, two-step, phenomenological model was derived by Qiu and Tien[25,26] by solving the Boltzmann equation. The model is appropriate for femto/picosecond laser heating since it considers three mechanisms of laser energy absorption by electrons, the transport of energy by electrons, and heating of the lattice by electron-lattice interactions. For ultrafast heating processes, Tzou[27] presented a unified dual-phase-lag (DPL) heat conduction model which accounts for the microscale temporal and spatial effects of heat transport *via* the introduction of phase-lags of heat flux $\tau_q$ and temperature gradient $\tau_T$:

$$\vec{q}(\vec{x}, t + \tau_q) = -k\vec{\nabla}T(\vec{x}, t + \tau_T) \tag{3}$$

The phase-lags, $\tau_q$ and $\tau_T$, are positive values and intrinsic properties of the material. The phase-lag of heat flux can be interpreted as the time delay due to the fast transient effect of thermal inertia, while the phase-lag of the temperature gradient represents the effect of phonon–electron interactions and phonon scattering during ultrafast heat transfer.[28] Depending on the value of phase-lags, alternative orders of Taylor series expansion can be made to provide a series of DPL heat conduction models.[29] Extending the thermoelastic model introduced by Green–Naghdi,[30] Choudhuri[31] proposed a three-phase-lag heat (TPL) conduction theory. The TPL heat conduction theory encompasses all the aforementioned non-Fourier heat conduction models by introducing the phase-lag of thermal displacement gradient ($\tau_\upsilon$), in addition to $\tau_q$ and $\tau_T$:

$$\vec{q}(\vec{x}, t + \tau_q) = -\left[k\vec{\nabla}T(\vec{x}, t + \tau_T) + k^*\vec{\nabla}\upsilon(\vec{x}, t + \tau_\upsilon)\right] \tag{4}$$

where $\upsilon$ is thermal displacement ($\dot{\upsilon} = T$), a field whose time derivative is the absolute temperature and has been first introduced by Helmholtz;[32,33] $k^*$ (>0) represents a positive material constant characteristics of the TPL theory, and $\tau_\upsilon$ is the phase-lag of thermal displacement gradient. Alternative parabolic and hyperbolic types of heat conduction can be developed by Taylor series expansion of eqn (4) with respect to time.[24,29]

The hyperbolic models of non-Fourier heat conduction can predict thermal wave propagation through a medium subjected to abrupt thermal disturbances. Nonetheless, the hyperbolic models suffer from the unrealistic singularity of temperature gradient across thermal wavefront. The fractional calculus for differentiation and integration can not only remove the thermal wave singularity but also enables the modification of existing formulation for physical processes, *e.g.* heat and mass transfer, in chemistry, biology, electronics, wave propagation, and chaos/fractals.[34–37] Non-Fourier heat conduction models with time-fractional derivatives can be derived by Taylor series expansion of an arbitrary time-fractional order $\alpha_F$ on the both sides of eqn (3) or (4). For instance, Ezzat *et al.*[36,38] introduced the three-phase-lag heat conduction model with time-fractional derivatives, called fractional three-phase-lag (FTPL), by taking a Taylor series expansion on the both sides of eqn (4) and retaining terms up to $2\alpha_F$-order for $\tau_q$ and up to the $\alpha_F$-order for $\tau_T$ and $\tau_\upsilon$ as follows:

$$\left(1 + \frac{\tau_q^{\alpha_F}}{\alpha_F!}\frac{\partial^{\alpha_F}}{\partial t^{\alpha_F}} + \frac{\tau_q^{2\alpha_F}}{(2\alpha_F)!}\frac{\partial^{2\alpha_F}}{\partial t^{2\alpha_F}}\right)\vec{q}(\vec{x}, t)$$
$$= -\left\{\left(k^T + \frac{k^*\tau_\upsilon^{\alpha_F}}{\alpha_F!}\frac{\partial^{\alpha_F - 1}}{\partial t^{\alpha_F - 1}} + \frac{k^T\tau_T^{\alpha_F}}{\alpha_F!}\frac{\partial^{\alpha_F}}{\partial t^{\alpha_F}}\right)\vec{\nabla}T(\vec{x}, t)\right.$$
$$\left. + k^*\vec{\nabla}\upsilon(\vec{x}, t)\right\} \quad 0 \le \alpha_F < 1 \tag{5}$$

All the aforementioned non-Fourier heat conduction models were based on the local/classical continuum mechanics approach. To accommodate the effect of thermomass, the distinctive mass of heat, of dielectric lattices in the heat conduction and size-dependency of thermophysical properties, Tzou[9,10] has included the nonlocal (NL) behavior of heat transport in space in addition to the thermal lagging of temperature gradient and heat flux, in time. The nonlocal dual-phase-lag (NL DPL) heat conduction can be written as:

$$\vec{q}\left(\vec{x} + \vec{\lambda}_q, t + \tau_q\right) = -k\vec{\nabla}T(x, t + \tau_T) \tag{6}$$

where $\vec{\lambda}_q$ is the correlating length of nonlocal heat flux. Tzou[9] has shown that the correlating length $\vec{\lambda}_q$ has the same form of the length parameter in the thermomass model.[39] Using the first-order Taylor series expansion of eqn (6) with respect to both correlating lengths and phase-lags, Tzou has developed the NL DPL heat conduction.

The aforementioned continuum heat conduction models have been applied for the heat transfer analysis in coupled

multiphysics problems for media of multiple scales (from nano to macro). For example, one can consider the heat transport modelling in magneto-thermoelasticity analysis,[40] hygro-thermal analysis of magnetoelectroelastic composites,[41,42] laser heating of gas-saturated porous media,[43] femtosecond laser processing of metals,[2] and non-isothermal heat flow of liquids and gas on the interface with solids.[44] Beside the continuum modelling of heat transfer, MD simulation is a powerful tool for the precise modelling of molecular interactions for nano/micro scale structures and thin films.[45] MD simulations with larger characteristic lengths and higher temperature ranges show better agreement with experimental data. Recent attempts for MD simulation of heat transfer have shown that the phonon heat transfer does not follow the continuum Fourier's law of heat conduction and approved the thermal wave propagation (second sound effect) in solid argon thin films and carbon nanotubes.[18,46–51]

In order to develop a robust heat conduction model, appropriate for multiscale heat transport and thermal wave propagation within nano/microscale to macroscale media, we first introduce in this paper (Section 2) a novel nonlocal fractional three-phase-lag (NL FTPL) heat conduction model. The NL FTPL model does not only detect thermal wave propagation and remove the discontinuity of temperature at thermal wavefront but also takes into account the size-dependency of thermophysical properties, subdiffusion or superdiffusion of heat transport, phonon–electron interaction, and the effect of thermal displacement in the ultrafast heat transport. We present in Section 3.1 series of semi-analytical solutions for continuum heat conduction in one-dimensional media with semi-infinite and finite length. The theoretical methodology can be extended to simulate thermal wave propagation in advanced materials with graded thermophysical properties. Afterwards, in Section 3.2, we implement MD simulation to approve the presence of thermal wave in nano/microscale heat transport and to confirm the validity of the introduced continuum model for heat conduction. Finally, the numerical results are presented in Section 4 to demonstrate the effect of non-Fourier heat conduction models, time-fractional order, length scale, phase-lags, material gradient, and embedded atom model (EAM) on thermal responses predicted by continuum heat conduction or MD simulation. The introduced multiscale heat conduction model can be applied to precisely simulate heat transfer in heat storage/conversion systems,[52] thermal energy harvesters,[53] selective laser-melting additive manufacturing,[54] smart metamaterials,[4,55–57] and ultralight lattices.[6]

## 2. NL FTPL model

In this section, we introduce a novel non-local, continuum mechanics model for the multiscale heat conduction analysis. On the basis of fractional calculus, nonlocal behavior, and phase-lag non-Fourier heat conduction, we introduce for the first time the nonlocal fractional three-phase-lag (NL FTPL) heat conduction model.

As discussed earlier in Introduction, Tzou[10] introduced a non-local model of phase-lag heat conduction called NL DPL.

As an extension, a non-local three-phase-lag (NL TPL) constitutive equation for the non-Fourier heat conduction can be derived in the following form to include the effects of thermal displacement, a scalar history variable called by Green and Naghdi,[58] and its associated nonlocal length in the NL DPL thermal analysis:

$$\vec{q}\left(\vec{x} + \vec{\lambda}_{\mathrm{q}}, t + \tau_{\mathrm{q}}\right) = -\left[k^{\mathrm{T}}\vec{\nabla}T\left(\vec{x} + \vec{\lambda}_{\mathrm{T}}, t + \tau_{\mathrm{T}}\right) + k^{*}\vec{\nabla}\upsilon\left(\vec{x} + \vec{\lambda}_{\upsilon}, t + \tau_{\upsilon}\right)\right] \quad (7)$$

where $\vec{\lambda}_{\mathrm{q}}$, $\vec{\lambda}_{\mathrm{T}}$, and $\vec{\lambda}_{\upsilon}$ represent correlating nonlocal lengths of heat flux, temperature gradient, and thermal displacement gradient. The Taylor series expansion of constitutive eqn (7) with respect to either nonlocal lengths and/or phase-lags leads to alternative nonlocal phase-lag heat conduction models. Among the heat conduction constitutive equation derived from eqn (7), only those with coordinate-independent properties must be retained.[59] To derive the non-local TPL heat conduction equation, the heat flux $\vec{q}(\vec{x},t)$ should be eliminated between eqn (7) and the following energy equation:

$$-\vec{\nabla}\cdot\vec{q}(\vec{x}, t) + R(\vec{x}, t) = \rho c_{\mathrm{p}}\frac{\partial T(\vec{x}, t)}{\partial t} \quad (8)$$

where $R(\vec{x},t)$, $\rho$, $c_{\mathrm{p}}$, and $\vec{\nabla}$ stand for the heat generation per unit time per unit volume, material density, specific heat at constant pressure, and divergence operator.

To enable the integration of subdiffusion or superdiffusion of heat transport, in addition to the effect of size-dependency of thermophysical properties and phonon–electron interaction, into the ultrafast heat conduction model, we introduce a novel nonlocal fractional three-phase-lag (NL FTPL) heat conduction model. The constitutive equation of NL FTPL heat conduction is defined as:

$$\vec{q}\left(\vec{x} + \vec{\lambda}_{\mathrm{q}}, t + \tau_{\mathrm{q}}\right) = -\left[k^{\mathrm{T}}I^{a_{\mathrm{F}}-1}\vec{\nabla}T\left(\vec{x} + \vec{\lambda}_{\mathrm{T}}, t + \tau_{\mathrm{T}}\right) + k^{*}I^{a_{\mathrm{F}}-1}\vec{\nabla}\upsilon\left(\vec{x} + \vec{\lambda}_{\upsilon}, t + \tau_{\upsilon}\right)\right] \quad 0 \le a_{\mathrm{F}} \le 2 \quad (9)$$

where $\alpha_{\mathrm{F}}$ is the time-fraction order of FTPL heat conduction and could refer to the generalized anomalous heat conduction.[60,61] Heat transport in materials with weak conductivity and sub-diffusivity, which could be observed in dielectrics and semi-conductors, corresponds to $0 < \alpha_{\mathrm{F}} < 1$, while $\alpha_{\mathrm{F}} = 1$ refers to normal conductive materials and $1 < \alpha_{\mathrm{F}} \le 2$ corresponds to the heat transfer in superconductive media like porous glasses and polymer chains.[62] The Riemann–Liouville fractional integral $I^{\alpha_{\mathrm{F}}}$ in eqn (9) is written in a convolution-form:[61,63]

$$I^{\alpha_{\mathrm{F}}}f\left(\vec{x}, t\right) = \int_{0}^{t}\frac{(t - \zeta)^{\alpha_{\mathrm{F}}-1}}{\Gamma(\alpha_{\mathrm{F}})}f(\vec{x}, \zeta)\mathrm{d}\zeta$$
$$I^{0}f\left(\vec{x}, t\right) = f(\vec{x}, t) \quad (10)$$

where $\Gamma(\ldots)$ represents the Gamma function. Alternative forms of constitutive equation of heat conduction can be derived by the Taylor series expansion of $\lambda_{\mathrm{q}}$, $\lambda_{\mathrm{T}}$, and $\lambda_{\upsilon}$ in the space domain and *via* the Taylor series expansion of $\tau_{\mathrm{q}}$, $\tau_{\mathrm{T}}$, and $\tau_{\upsilon}$ in the time domain.

The NL FTPL heat conduction equation is derived by eliminating the heat flux $\vec{q}(\vec{x},t)$ between the energy equation (eqn (8)) and the constitutive equation (eqn (9)). For eqn (9), we implement here the second-order Taylor series expansion of $\lambda_q$, $\lambda_T$, and $\lambda_\upsilon$ in the space domain and the second-order Taylor series expansion of $\tau_q$, $\tau_T$, and $\tau_\upsilon$ in the time domain to derive a general heat conduction model for NL FTPL. We take divergence and time-derivative of the subsequent constitutive equation and eliminate $\vec{\nabla}\cdot\vec{q}$ *via* the time-derivative of energy eqn (8) to derive the following NL FTPL heat conduction equation:

$$\left(1 + \vec{\lambda}_q\cdot\vec{\nabla} + \left(\frac{\vec{\lambda}_q\cdot\vec{\lambda}_q}{2}\right)\nabla^2 + \tau_q\frac{\partial}{\partial t} + \frac{1}{2}\tau_q{}^2\frac{\partial^2}{\partial t^2}\right)$$

$$\times\left[\frac{1}{\alpha}\frac{\partial^2 T(\vec{x},t)}{\partial t^2} - \frac{1}{k^T}\frac{\partial R(\vec{x},t)}{\partial t}\right]$$

$$= \vec{\nabla}\cdot\left\{\left(1 + \vec{\lambda}_T\cdot\vec{\nabla} + \left(\frac{\vec{\lambda}_T\cdot\vec{\lambda}_T}{2}\right)\nabla^2 + \tau_T\frac{\partial}{\partial t} + \frac{1}{2}\tau_T{}^2\frac{\partial^2}{\partial t^2}\right)\frac{\partial}{\partial t}\right.$$

$$\left. + \frac{k^*}{k^T}\left(1 + \vec{\lambda}_\upsilon\cdot\vec{\nabla} + \left(\frac{\vec{\lambda}_\upsilon\cdot\vec{\lambda}_\upsilon}{2}\right)\nabla^2 + \tau_\upsilon\frac{\partial}{\partial t} + \frac{1}{2}\tau_\upsilon{}^2\frac{\partial^2}{\partial t^2}\right)\right\}I^{\alpha_F-1}\vec{\nabla}T$$

$$(11)$$

where $\alpha = \dfrac{k}{\rho c_p}$ is thermal diffusivity. Depending on the values of nonlocal lengths and phase-lags as well as the order of Taylor series expansion, eqn (11) could include alternative forms of diffusive-like or wave-like NL FTPL heat conduction. Since the heat conduction equation should be coordinate-independent, and considering that $\vec{\lambda}_q$ is the only nonlocal length scale related to existing microscale/nanoscale heat transfer models, we hereafter consider merely the nonlocal length $\vec{\lambda}_q$, and implement the Taylor series expansion of space domain up to the first-order. As a result, the following wave-like NL FTPL for a homogenous medium is derived by simplifying the NL FTPL heat conduction equation introduced in eqn (11) which implies the first-order Taylor series expansion of $\lambda_q$ in space and the second-order Taylor series expansion of $\tau_q$ and the first-order Taylor series expansion of $\tau_T$ and $\tau_\upsilon$ in time:

$$\left(1 + \vec{\lambda}_q\cdot\vec{\nabla} + \tau_q\frac{\partial}{\partial t} + \frac{1}{2}\tau_q{}^2\frac{\partial^2}{\partial t^2}\right)\left[\frac{1}{\alpha}\frac{\partial^2 T(\vec{x},t)}{\partial t^2} - \frac{R(\vec{x},t)}{k^T}\right]$$

$$= \left\{\left(1 + \tau_T\frac{\partial}{\partial t}\right)\frac{\partial}{\partial t} + \frac{k^*}{k^T}\left(1 + \tau_\upsilon\frac{\partial}{\partial t}\right)\right\}I^{\alpha_F-1}\nabla^2 T \quad (12)$$

It is worth to recall that $\lambda$ presents the length parameter in a thermomass model describing the effect of phonon gas in dielectrics,[9] $\tau_q$, $\tau_T$, and $\tau_\upsilon$ present delayed thermal responses due to the collisions of electrons and phonons, temporary momentum loss, normal relaxation in phonon scattering, and internal energy relaxation,[10,24,31] and time-fractional derivative ($\alpha_F$) removes thermal wave singularity across thermal wavefront and is used to present the subdiffusion ($0 \leq \alpha_F < 1$), normal diffusion ($\alpha_F = 1$), and superdiffusion phenomena ($1 < \alpha_F < 2$).[61,64]

# 3. One-dimensional heat conduction

To examine the propagation of thermal disturbances in a solid medium and explore the characteristics of thermal wave, we focus on the heat conduction in one-dimensional (1D) isotropic media. The solid 1D slab shown in Fig. 1, which can be finite or semi-infinite in multiple scales, is initially ($t = 0$) at a constant temperature $T_0$ and is thermally disturbed from a stationary state $\left(\dfrac{\partial T(x,t)}{\partial t} = 0 \quad \text{at } t = 0\right)$. In the absence of heat source within the slab, the surface temperature of the left side of the slab ($x = 0$) is suddenly raised to $T_{WL}$, while the surface temperature of the right side is kept at initial temperature. The sudden temperature rise causes the propagation of thermal disturbance through the medium, which is investigated in Sections 3 and 4 *via* the continuum NL FTPL heat conduction model as well as the MD simulation. In this section, we first introduce the solutions for the continuum heat conduction model and then elucidate the procedure for the MD simulation of ultrafast heat transport in a nano/micro slab.

## 3.1. Continuum NL FTPL heat conduction analysis

The solution of continuum NL FTPL heat conduction eqn (12) is sought in this section for slabs with homogenous and functionally graded (FG) properties. For the analysis, we introduce the following non-dimensional parameters:

$$\theta = \frac{T - T_0}{T_w - T_0}, \quad \beta = \frac{t}{\tau_q}, \quad \zeta = \frac{x}{\sqrt{\alpha\tau_q}}, \quad Z = \frac{\tau_T}{\tau_q}, \quad Z^* = \frac{\tau_\upsilon}{\tau_q},$$

$$L = \frac{\lambda_q}{\sqrt{\alpha\tau_q}}, \quad C_K = \frac{\tau_q k^{*T}}{k^T} \quad (13)$$

Presenting the numerical thermal responses in the above-mentioned non-dimensional form enables us to generalize the thermal wave characteristics to both nano/microscale and macroscale materials.

**3.1.1. Continuum heat conduction in a homogenous isotropic slab.** The wave-like NL FTPL heat conduction eqn (12) in the absence of heat source and the initial and boundary conditions can be written in the non-dimensional form as follows:

$$\frac{\partial^2\theta(\zeta,\beta)}{\partial\beta^2} + L\frac{\partial^3\theta(\zeta,\beta)}{\partial\beta^2\partial\zeta} + \frac{\partial^3\theta(\zeta,\beta)}{\partial\beta^3} + \frac{1}{2}\frac{\partial^4\theta(\zeta,\beta)}{\partial\beta^4}$$

$$= I^{\alpha_F-1}C_K\frac{\partial^2\theta(\zeta,\beta)}{\partial\zeta^2} + I^{\alpha_F-1}(1 + C_K Z^*)\frac{\partial^3\theta(\zeta,\beta)}{\partial\zeta^2\partial\beta}$$

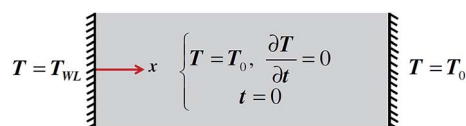$$+ I^{\alpha_F-1}Z\frac{\partial^4\theta(\zeta,\beta)}{\partial\zeta^2\partial\beta^2} \quad (14a)$$



Fig. 1 Thermal boundary and initial conditions of a 1D slab in multiple scale (from nanoscale to macroscale).

$$\theta(\zeta,0) = \frac{\partial\theta(\zeta,0)}{\partial\beta} = 0 \quad \text{(initial conditions)} \tag{14b}$$

$$\theta(0,\beta) = 1, \theta(\zeta_R,\beta) = 0 \quad \text{(boundary conditions)} \tag{14c}$$

where $\zeta_R$ represents the non-dimensional length of the medium, which is assumed $\zeta_R = 10$ in this paper for the numerical thermal responses. The NL FTPL heat conduction eqn (14a) shows that the nonlocal length of heat flux $L$, in the absence of heat generation, only contributes in the mixed-derivative term $\frac{\partial^3\theta(\zeta,\beta)}{\partial\beta^2\partial\zeta}$ implying the negligible effect of heat flux nonlocality on the thermal responses for long-term and steady-state heat transport analysis and the reduction of thermal behavior of NL FTPL to transient Fourier heat conduction.[19,24]

Due to the time-dependency of transient NL FTPL heat conduction, the solution of temperature in eqn (14) is found in the Laplace domain. The Laplace transform of a temperature function $\theta(\vec{x},t)$ is defined as:

$$L\left\{f(\vec{x},t)\right\} = \tilde{f}(\vec{x},s) = \int_0^\infty f(\vec{x},\xi)e^{-s\xi}d\xi \tag{15}$$

where $s$ represents the Laplace variable. The closed-form solution of NL FTPL heat conduction eqn (14a) in the Laplace domain can be found as:

$$\theta(\zeta,\beta) = \frac{e^{r_2\zeta_R}}{e^{r_2\zeta_R} - e^{r_1\zeta_R}}e^{r_1\zeta} - \frac{e^{r_1\zeta_R}}{e^{r_2\zeta_R} - e^{r_1\zeta_R}}e^{r_2\zeta} \tag{16}$$

where $r_1$ and $r_2$ are characteristic roots of eqn (14a) in the Laplace domain:

$$r_{1,2} = \frac{Ls^2 \pm \sqrt{L^2s^4 + 4s^{-\alpha_F+3}(C_K + (1 + C_KZ^*)s + Zs^2)\left(1 + s + \frac{s^2}{2}\right)}}{2s^{-\alpha_F+1}(C_K + (1 + C_KZ^*)s + Zs^2)} \tag{17}$$

It is worth mentioning that the following identity has been used for the Laplace transform of Riemann–Liouville fractional integral to derive the closed-form solutions given in eqn (16):[61]

$$L\{I^{\alpha_F}f(t)\} = \frac{1}{S^{\alpha_F}}L\{f(t)\} \quad \alpha_F > 0 \tag{18}$$

To retrieve temperature in the time domain, either Riemann sum approximation[59] or the fast Laplace inverse transform[65] can be used. For the case of a semi-infinite slab, the term associated with a positive characteristic root ($r_1$ or $r_2$) in the closed-form solution (eqn (16)) should be omitted to satisfy the thermal boundary condition $T = T_0$ for locations very far from the thermal excitation ($x \to \infty$).

**3.1.2. Continuum heat conduction in a functionally graded material slab.** Biological materials, *e.g.* Moso culm bamboo,[66] dento-enamel-junction of natural teeth,[67] and the Humboldt squid beak,[68] have a multi-scale hierarchical and functionally graded (FG) structure. Thanking to the gradation of micro-structure morphology, porosity, and chemical/material ingredients in functionally graded materials (FGMs), FGMs have a unique potential as materials resistant to the contact damage, cracking, deflection, thermal stresses, and heat flow.[69–75] FGMs also enable the engineering of advanced materials with tuned multiphysics properties to satisfy mechanical, hygrothermal, electrical, and biological requirements for a wide range of applications in thermal barriers, bone tissues and implants, and thermoelectric generators and energy harvesters. Advances in powder metallurgy,[76] laser cutting,[57] and additive manufacturing/3D printing[77] have also facilitated the arbitrary variation of material gradient and micro-architecture of functionally graded solid and porous materials in order to reach optimum multiphysical properties. As a result, we present solutions for temperature evolution and thermal wave propagation in an FGM nano/micro-slab to explore the effect of material gradation on the characteristics of NL-FTPL thermal wave.

The material properties of FGMs can be arbitrarily tailored through the variation of volume fraction of constituent solid components. To provide close-form solutions for transient temperature changes in the Laplace domain, we adopt the following exponential variation for thermal conductivity ($k$), material constant of the TPL theory ($k^*$), and specific heat per volume ($\rho c$) through the length of FGM slab:

$$k = k_0 e^{n_G x}, \quad k^* = k_0^* e^{n_G x}, \quad (\rho c_p) = C_0 e^{n_G x} \tag{19}$$

where $n_G$ stands for the FGM exponential index for the variation of material properties.[78] The other thermophysical properties are assumed constant throughout the slab. The wave-like NL FTPL heat conduction equation for an FGM medium in the absence of heat source can be derived by substituting eqn (19) into (11) and using the non-dimensional parameters given in eqn (13):

$$\left(1 + n'L\right)\frac{\partial^2\theta(\zeta,\beta)}{\partial\beta^2} + L\frac{\partial^3\theta(\zeta,\beta)}{\partial\beta^2\partial\zeta} + \frac{\partial^3\theta(\zeta,\beta)}{\partial\beta^3} + \frac{1}{2}\frac{\partial^4\theta(\zeta,\beta)}{\partial\beta^4}$$
$$= I^{\alpha_F-1}C_K\frac{\partial^2\theta(\zeta,\beta)}{\partial\zeta^2} + n'I^{\alpha_F-1}\frac{\partial^2\theta(\zeta,\beta)}{\partial\beta\partial\zeta}$$
$$+ I^{\alpha_F-1}(1 + C_KZ^*)\frac{\partial^3\theta(\zeta,\beta)}{\partial\zeta^3\partial\beta} + I^{\alpha_F-1}Z\frac{\partial^4\theta(\zeta,\beta)}{\partial\zeta^2\partial\beta^2} \tag{20}$$

where $n' = n_G\sqrt{\alpha\tau_q}$. The solution of eqn (20) in the Laplace domain leads to a closed-form solution given in eqn (16) with the modified characteristic roots as:

$$r_{1,2} = \frac{\left(Ls^2 - n'S^{-\alpha_F+2}\right) \pm \sqrt{\left(Ls^2 - n'S^{-\alpha_F+2}\right)^2 + 4s^{-\alpha_F+3}\left(C_K + (1 + C_K Z^*)s + Zs^2\right)\left(1 + n'L + s + \frac{s^2}{2}\right)}}{2s^{-\alpha_F+1}(C_K + (1 + C_K Z^*)s + Zs^2)} \qquad (21)$$

Temperature is then retrieved in the time domain by using a numerical Laplace inversion.

### 3.2. Molecular dynamics (MD) simulation for thermal analysis

In this section, we present the MD simulation of thermal wave propagation in a relatively-long nano-slab, representing the one-dimensional heat transport. The results of MD simulation enable us to observe the thermal wave propagation in nano/microscale heat transport and to compare qualitatively the MD results with those predicted in Section 3.1 by the non-Fourier, continuum, NL FTPL heat conduction model.

The MD simulation is implemented by LAMMPS software package.[79] The geometry of a nano-slab considered here for the MD simulation is shown in Fig. 2. The dimensions of the copper single-crystalline nano-slab are 361.5 nm (length), 7.23 nm (width), and 7.23 nm (height). To implement the MD simulation, the following steps are taken:

(1) The copper nano-slab is created by face-centred-cubic lattices.

(2) The atoms are initialized with random velocities.

(3) The nano-slab is equilibrated at room temperature 300 K for 20 picosecond (ps) under Noose–Hoover thermostat (NVT) ensembles.[80] The temperatures of both hot and cool zones of the equilibrated nano-slab are fixed by rescaling their atoms at each time step.

(4) The temperature of the fixed hot zone of the nano-slab is suddenly increased to 1000 K which replicates the thermal boundary condition of continuum NL FTPL heat conduction modelling for a slab subjected to a sudden temperature rise.

The MD simulation is implemented in this paper with a time step of 1 femtosecond (fs) for a time period of 10 ps before thermal wavefront reaches the right end of nano-slab. We apply a time integration scheme which closely follows the time-reversible measure-preserving Verlet and rRESPA integrators derived by Tuckerman et al.[81] The NVE integration is used to update the position and velocity of atoms at each time-step and to provide a system trajectory consistent with the micro-canonical ensemble.

It is worth mentioning that heat transfer in solids is carried out by electrons and phonons. Consequently, it is critical to precisely capture the interactions among atoms and electrons in the applied atomic potential of the MD simulation. The atomic interactions are described here through the embedded atom method (EAM) potential.[82] The total potential energy of the atoms is given as:

$$E = \sum_i F^i\left(\sum_{i \neq j} \rho^i(r_{ij})\right) + \frac{1}{2}\sum_{ij,i \neq j} \phi^{ij}(r_{ij}) \qquad (22)$$

where $r_{ij}$ represents the distance between atoms $i$ and $j$, $\rho^i$ is the contribution of the electron charge density, $F^i$ is the sum of individual embedding function of atom $i$, and $\phi^{ij}$ denotes a pairwise potential function between atoms. To evaluate the temperature along the major length of the slab, the copper nano-slab is divided into 100 segments. The average temperature of each segment along the nano-slab is:

$$T_{seg} = \frac{\sum_i mv_i^2}{3N_{seg}k_B} \qquad (23)$$

where $m$ is atomic mass, $v_i$ is velocity of atom $i$, $N_{seg}$ is the number of atoms in each segment, and $k_B$ is the Boltzmann constant. The temperature $T_{seg}$ represents an average value for each segment, which varies from one segment to another due to the interaction between atoms.

## 4. Results and discussion

The continuum and MD methodologies introduced above for a multiscale heat conduction is applied to a nano/micro-slab in order to investigate the characteristics of thermal wave propagating through a homogenous or an FGM medium. The left side of the slab suddenly experiences an increased temperature of
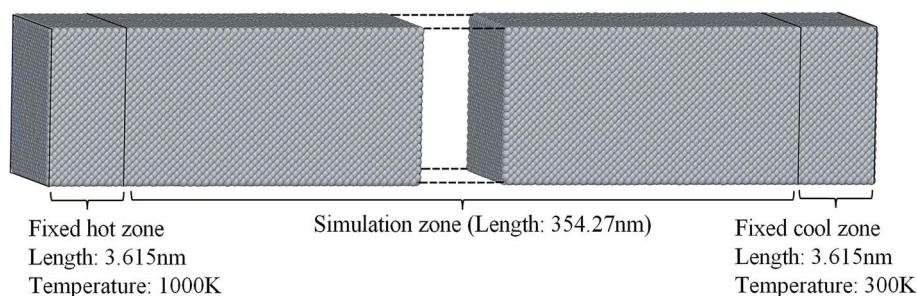


Fixed hot zone
Length: 3.615nm
Temperature: 1000K

Simulation zone (Length: 354.27nm)

Fixed cool zone
Length: 3.615nm
Temperature: 300K

Fig. 2   A nano-slab considered for MD simulation for thermal wave propagation analysis.

$T_{WL}$ while the left side remains at the initial/environmental temperature $T_0$. Numerical continuum and MD modelling are implemented respectively *via* coding in MATLAB and LAMMPS software packages. In this section, we present in detail the characteristics of thermal wave in both local/nonlocal, non-Fourier continuum heat conduction and MD heat transfer. We specifically explore the effects of alternative heat conduction models, the values of fractional-order $\alpha_F$, TPL parameter $C_K$, correlation length $L$, phase-lag ratios $Z$ and $Z^*$, non-homogeneity index $n_G$, molecular interaction, and embedded atom model on the characteristics of thermal wave.

### 4.1.   Effect of alternative continuum heat conduction models

To better understand the characteristics of alternative continuum heat conduction models, temperature distribution developed within a semi-infinite slab subjected to an increased temperature of $\theta = 1$ on its left side is depicted in Fig. 3 for 10 alternative heat conduction models at non-dimensional time $\beta = 1$. Fig. 3 compares temperature distribution at non-dimensional time $\beta = 1$ for the Fourier, C–V, nonlocal C–V (NL C–V) ($L = 1$), diffusive-like and wave-like DPL ($Z = 10$), wave-like fractional DPL (FDPL) ($Z = 10$, $\alpha_F = 0.95$), wave-like TPL ($Z = Z^* = 10$, $C_K = 0.3$), wave-like FTPL ($\alpha_F = 0.95$, $Z = Z^* = 10$, $C_K = 0.3$), wave-like NL TPL ($L = 1$, $Z = Z^* = 10$, $C_K = 0.3$), and wave-like NL FTPL ($L = 1$, $\alpha_F = 0.95$, $Z = Z^* = 10$, $C_K = 0.3$) continuum heat conduction models, all reduced from eqn (11) and (12). Except the Fourier and diffusive-like DPL heat conduction models, all heat conduction models reveal the propagation of thermal disturbance in the form of wave. However, unrealistic sharp thermal wavefront is observed in the temperature profile of C–V, NL C–V, wave-like
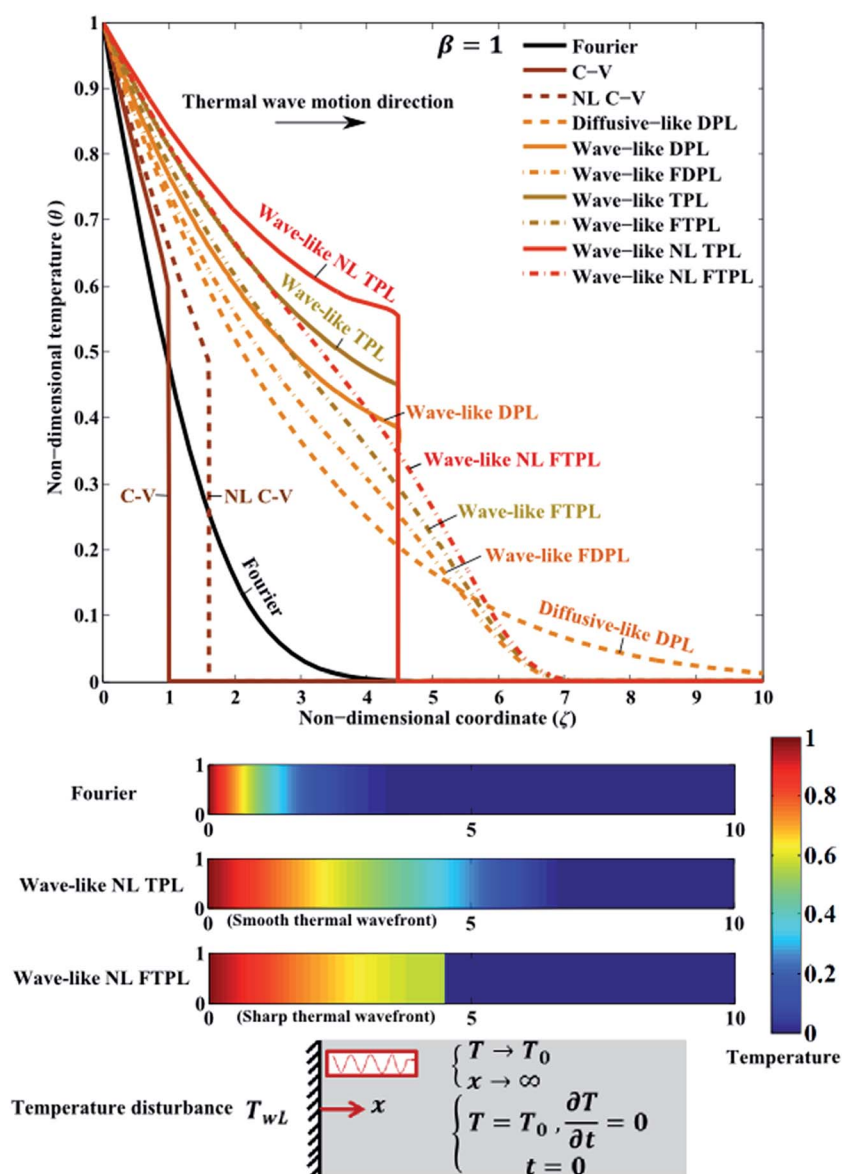


Fig. 3 Comparison of thermal responses of alternative continuum heat conduction models at the non-dimensional time $\beta = 1$ in an infinite homogenous medium subjected to an abrupt increased temperature on the left side.

DPL, and wave-like TPL, wave-like NL TPL heat conduction models. A sharp thermal wavefront divides the thermal response domain into the heat affected and unaffected zones and causes the discontinuity of temperature and resulting thermal strain fields. As reported by Tzou[10] and confirmed by the numerical results provided in Fig. 3, the thermal wave speed of NL C–V model ($C_{\text{NL C–V}}$) is higher than the C–V model ($C_{\text{C–V}}$); $C_{\text{NL C–V}} = \dfrac{\sqrt{4+L^2}+L}{2}C_{\text{C–V}}$ where dimensional C–V thermal wave speed is $C_{\text{C–V}} = \sqrt{\dfrac{\alpha}{\tau_{\text{q}}}}$ or $x = C_{\text{C–V}}t = \sqrt{\dfrac{\alpha}{\tau_{\text{q}}}}t$. As observed in Fig. 3, thermal wave speed of wave-like DPL ($C_{\text{wave-like DPL}}$), wave-like TPL ($C_{\text{wave-like TPL}}$), and wave-like NL TPL ($C_{\text{wave-like NLTPL}}$) are equal and their thermal wave speed can be mathematically expressed as: $C_{\text{wave-like DPL}} = C_{\text{wave-like TPL}} = C_{\text{wave-like NL TPL}} = \sqrt{2Z}C_{\text{C–V}}$ using eqn (14a).[19] As a result:

$$C_{\text{NL C–V}} > C_{\text{C–V}} > C_{\text{wave-like DPL}} = C_{\text{wave-like TPL}}$$
$$= C_{\text{wave-like NL TPL}} \quad \text{for } Z < \frac{2+L^2+L\sqrt{4+L^2}}{4}$$

$$C_{\text{wave-like DPL}} = C_{\text{wave-like TPL}} = C_{\text{wave-like NL TPL}} \geq C_{\text{NL C–V}} \geq C_{\text{C–V}}$$
$$\text{for } Z \geq \frac{2+L^2+L\sqrt{4+L^2}}{4} \quad (24)$$

For the assumed $Z = 10$ and $L = 1$ in Fig. 3, the thermal wavefront of the wave-like DPL, TPL, and NL TPL models is ahead of NL C–V models, all ahead of the C–V model. As mentioned above, depending on the continuum non-Fourier heat conduction model, thermal wave speed can be related to the phase-lags of temperature gradient and heat flux, thermal diffusivity, and correlating length.

It is worth mentioning that although both classical Fourier heat conduction and diffusive-like DPL models do not show a finite thermal wave speed, the thermal affected zones are not the same for these two models, as observed in Fig. 3. Further detailed analyses reveal that the diffusive-like DPL model leads to a wider affected zone compared to the classical Fourier heat conduction for $Z > 1$, while the thermal affected zone is narrower for $Z < 1$. Fig. 3 shows that the thermal behavior predicted by the wave-like NL TPL, TPL, and DPL models are similar; nonetheless, the NL TPL model predicts a higher temperature range for thermal affected zone behind the thermal wavefront location. As seen in Fig. 3, introducing time-fractional derivatives in fractional order heat conduction models of wave-like FDPL, FTPL, and NL FTPL effectively removes the singularity of temperature field around thermal wavefront because of the $I^{\alpha_{\text{F}}-1}Z\dfrac{\partial^4\theta(\zeta,\beta)}{\partial\zeta^2\partial\beta^2}$ term in heat conduction equation of (14a). While smooth and continuous variation of temperature is observed in the thermal response of fractional heat conduction and thermal wave speed is the same for all wave-like FDPL, FTPL, and NL FTPL models, NL FTPL model leads to

a higher temperature range for thermal affected zones. As depicted in Fig. 3, the NL FTPL heat conduction model simultaneously detects thermal wave propagation, removes the discontinuity of temperature at thermal wavefront, and enables taking into account the effect of length scale and microstructural heat transport on thermal responses.

### 4.2. Characteristics of NL FTPL thermal wave

In this section, we explore the effect of driving parameters of the NL FPL continuum heat conduction model on the characteristics of thermal wave propagating through the homogenous nano/micro slab. The most significant parameters of NL FTPL heat conduction are: $\alpha_{\text{F}}$, $C_{\text{K}}$, $L$, $Z$, and $Z^*$.

Fig. 4 depicts the effect of the order of time-fractional derivative on the thermal behavior. As seen in this figure, $\alpha_{\text{F}} = 1$ reduces the NL FTPL model to the NL TPL heat conduction with a sharp thermal wavefront. Reducing the fractional-order $\alpha_{\text{F}}$ gradually removes the discontinuity of temperature at thermal wavefront and makes wider the thermal affected zone in the back of thermal wavefront; for example, the thermal affected zone of $\alpha_{\text{F}} = 0.8$ is about 58% wider than the zone associated with $\alpha_{\text{F}} = 0.1$. Decreasing $\alpha_{\text{F}}$ from 1 to 0.5 completely destroys the thermal wave and makes the temperature profile similar to the Fourier heat conduction.

Fig. 5 shows the effect of non-dimensional TPL parameters $C_{\text{K}}$ and correlation length $L$ on the temperature profile of a nano/micro-slab predicted by the wave-like NL FTPL heat conduction model with material properties of $\alpha_{\text{F}} = 0.8$ and $Z = Z^* = 10$. Because of the application of fractional derivative $\alpha_{\text{F}} = 0.8$ in the NL FTPL heat conduction model, the sharp thermal wavefront does not appear in the temperature profile.
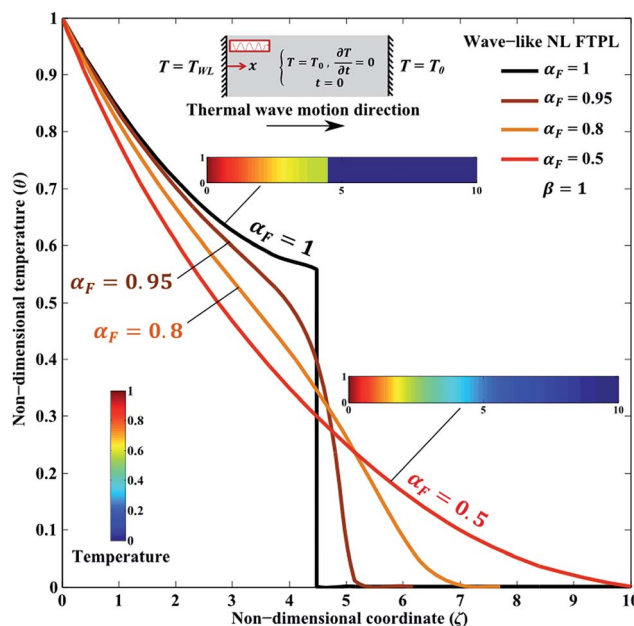


**Fig. 4** Effect of fractional order ($\alpha_{\text{F}}$) on non-dimensional temperature distribution at non-dimensional time $\beta = 1$ predicted by NL FTPL heat conduction model ($L = 1$, $Z = 10$, $Z^* = 10$, $C_{\text{K}} = 0.3$).
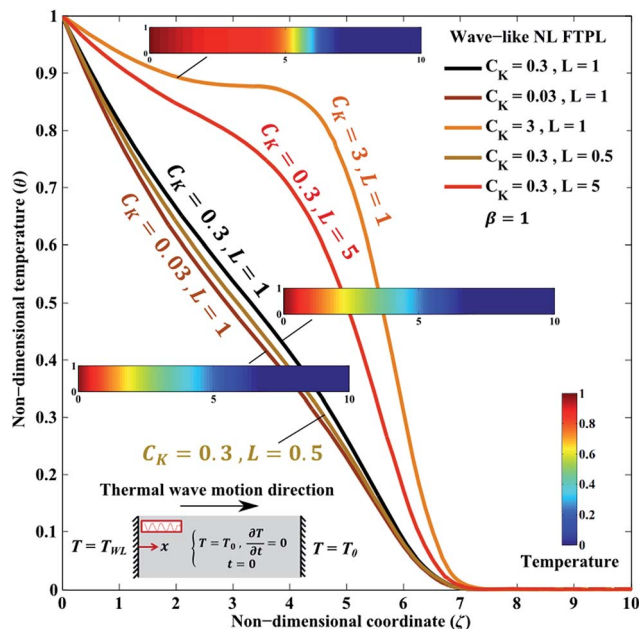
Fig. 5 Effect of non-dimensional TPL parameter ($C_K$) and non-dimensional correlation length ($L$) on non-dimensional temperature distribution at non-dimensional time ($\beta = 1$) using NL FTPL heat conduction model ($\alpha_F = 0.8$, $Z = 10$, $Z^* = 10$).



Fig. 6 Effect of non-dimensional phase-lag ratios $Z$ and $Z^*$ on non-dimensional temperature distribution at non-dimensional time $\beta = 1$ using NL FTPL heat conduction model ($L = 1$, $C_K = 0.3$, $\alpha_F = 0.8$).

Considering eqn (14a), it is found that $C_K$ and $L$ similarly contribute to the NL FTPL heat conduction by respectively introducing the third-order, mixed derivatives of $\frac{\partial^3 \theta(\zeta, \beta)}{\partial \zeta^2 \partial \beta}$ and $\frac{\partial^3 \theta(\zeta, \beta)}{\partial \beta^2 \partial \zeta}$ in the heat conduction differential equation. As a result, $C_K$ and $L$ has similar effect on the temperature profile. Increasing $C_K$ and $L$ enhances temperature in the thermal affected zone behind thermal wavefront, while the location of thermal affected zone and thermal wavefront is independent of $C_K$ and $L$ parameters.

To further explore the effect of phase-lags of temperature gradient, heat flux, and thermal displacement gradient on the thermal behavior of wave-like NL FTPL model, we present in Fig. 6 the temperature profile of the nano/micro-slab at the non-dimensional time $\beta = 1$ for alternative values of phase-lag ratios $Z$ and $Z^*$. As mentioned earlier in Section 4.1, the thermal wave speed of wave-like NL TPL model can be estimated by $C_{\text{wave-like NL TPL}} = \sqrt{2Z}C_{\text{C-V}}$. Although this formulation is not viable for the NL FTPL heat conduction model, due to the destroyed thermal wavefront by time fractional derivatives, the formulation could still be used to approximately estimate the location of thermal affected zone. As a result, increasing the phase-lag ratio of temperature gradient to heat flux ($Z$) makes wider the thermal affected zone since it enhances the speed of thermal wave propagation, a phenomenon that is also observed in Fig. 6. For example, while the thermal affected zone for $Z = 5$ and $Z^* = 10$ is $0 \leq \zeta \leq 5$, the affected zone is $0 \leq \zeta \leq 7.15$ for $Z = 10$ and $Z^* = 10$ which confirms that the thermal affected zone of the NL FTPL heat conduction is expanded to $5 \times \sqrt{2} \approx 7.07$ when $Z$ is increased from 5 to 10. Opposite to $Z$, $Z^*$ does not alter
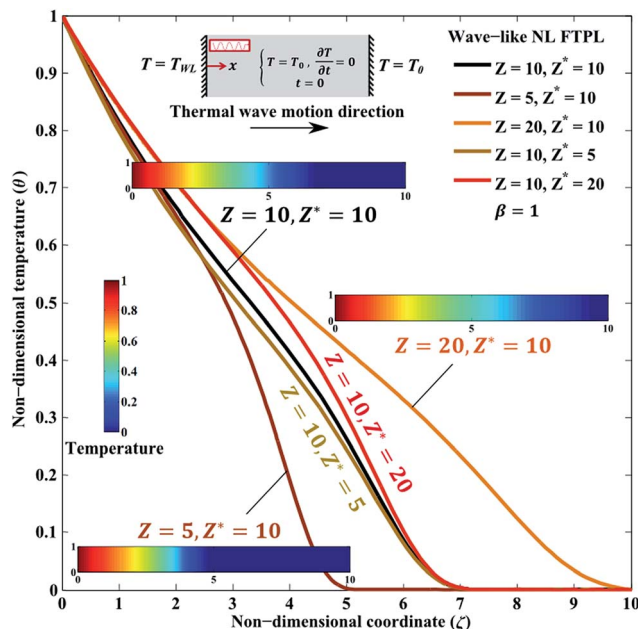
the NL FTPL thermal wave speed and only tailors the temperature within the thermal affected zone. As shown in Fig. 6, increasing the thermal displacement to heat flux phase-lag ratio of $Z^*$ from 5 to 20 slightly enhances temperature at all locations within the thermal affected zone $0 \leq \zeta \leq 7.15$. It is worth mentioning that vanishing the value of $Z$ ($Z \cong 0$) could result in diverged and noisy temperature profiles for the NL FTPL heat conduction similar to those observed for the wave-like DPL and TPL heat conduction models.[24]

### 4.3. Effect of material gradation on thermal wave

As discussed in Section 3.1.2, the microstructure of most of biological materials like bamboo, tooth, and squid beak reveals the smooth variation of properties within the material. In this section, we present the temperature profile in an exponentially graded FGM nano/micro-slab at non-dimensional time $\beta = 1$ based on the NL FTPL heat conduction model. Fig. 7 specifically depicts the effect of FGM exponential index $n_G$ (defined in eqn (19)) on the characteristics of NL FTPL thermal wave. As seen in this figure, the NL FTPL thermal wave speed is constant and independent of non-homogeneity index $n_G$ for this specific type of FGM materials; a phenomenon emanating from the absence of non-homogeneity index parameter $n' = n_G\sqrt{\alpha\tau_q}$ in terms of the highest order of temperature derivatives in NL FTPL differential heat conduction eqn (20). While the material gradation does not alter the thermal wave speed for this specific, exponentially graded FGM materials based on the NL FTPL model, thermal wave speed might varies within the FGM medium or be altered by the non-homogeneity index for FGM materials with an arbitrary variation of properties when it is predicted by the DPL or C–V heat conduction models.[19,24,83]
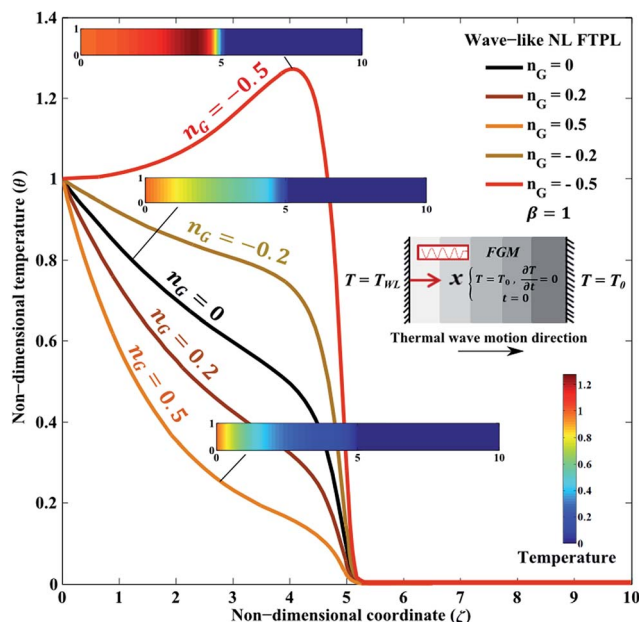
**Fig. 7** Effect of material non-homogeneity index of FGM slab on non-dimensional temperature distribution at non-dimensional time ($\beta = 1$) using NL FTPL heat conduction model ($L = 1$, $C_K = 0.3$, $\alpha_F = 0.95$, $Z = 10$, $Z^* = 10$).

Fig. 7 shows that material gradation can effectively tailor temperature within the thermal affected zone, which is of significant importance for avoiding failure and fracture in composite materials used for thermal shielding against excessive thermal disturbance. Increasing the FGM exponential index $n_G$ from $-0.5$ to $0.5$ can remarkably reduce temperature within the thermal affected zone of FGM medium. In the meantime, decreasing the FGM exponential index $n_G$ can magnify temperature at the thermal wavefront causing temperature within the FGM medium to exceed the temperature at the boundaries; for example, the maximum temperature within an FGM medium with $n_G = -0.5$ is about 30% higher than the maximum temperature occurred within a homogenous medium $n_G = 0$. As a result, material gradation can potentially improve the performance of advanced materials used in extreme environmental conditions if the material gradation index is selected appropriately.

### 4.4. Characteristics of thermal wave in MD heat transfer

In this section, we present the MD results for heat transfer in the nano-slab described in Section 3.2 to discover the existence of thermal wave in molecular level and to compare qualitatively thermal characterizations in the molecular and continuum scales. From these perspectives, Fig. 8 presents the snapshot of the squared velocity of atoms, normalized with spatial average temperature, along the nano-slab at the instance of 4 ps after the thermal disturbance of nano-slab. Distinguished from the continuum heat transfer presented through the NL FTPL heat conduction theory, the squared velocity of each atom is depicted here to represent the "local temperature".[50] The velocity contours presented in Fig. 8 are associated with a single run of MD simulation. The velocity of each atom is non-dimensionalized by the spatial average temperature to characterize the local temperature inside the nano-slab. The value of squared velocity varies among the atoms; some of the squared velocities are extremely small compared to the mean value, while the others are the opposite. As seen in Fig. 8a and b, at $t = 4$ ps, only the magnified zone with a finite length have experienced a thermal disturbance while the rest of the nano-slab has almost remained in their initial condition, which implies the propagation of thermal wave along the slab length. Once an appropriate threshold is chosen for temperature, thermal wave can be better depicted with those atoms remained in the zone of interest; Fig. 8c, for example, depicts atoms with non-dimensional square velocity higher than 14.1.

As seen in eqn (23), average thermodynamic temperature is related to mean square velocity of atoms. To better understand the nature of propagation of thermal disturbances in nanoscale materials, Fig. 9 shows temperature profile in a copper nano-slab at different time. The temperature profile is similar to the observed temperature in a nano argon film[48] and reveals temperature evolution in a nano-slab in the form of thermal wave. The thermal wave is observed to travel from the hot surface on the left side of the nano-slab towards the cold surface on the right. Further investigation in the MD results, presented in Fig. 9, provides us with an estimate of thermal wave speed $C_{MD} = 23\text{–}25 \times 10^3$ m s$^{-1}$ for a copper nano-slab. Correlating the thermal wave speed estimated by MD simulation with the speed of sharp thermal wavefront predicted by the NL C–V model,[10] the correlating length $\lambda_q$ defined in eqn (9) can be estimated as:
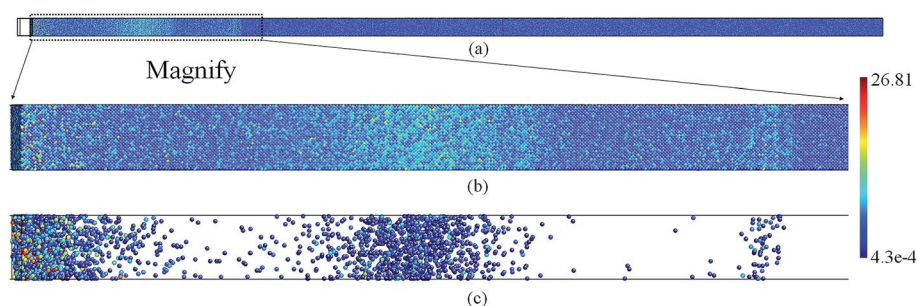


**Fig. 8** (a) Non-dimensional square velocity of atoms in the simulation zone at $t = 4$ ps in the nano-slab. (b) The magnified zone with moving thermal wave is shown in. (c) The atoms identified with non-dimensional square velocity higher than 14.1. (The square velocity of each atom is non-dimensionalized by the mean square velocity of the simulation zone.)
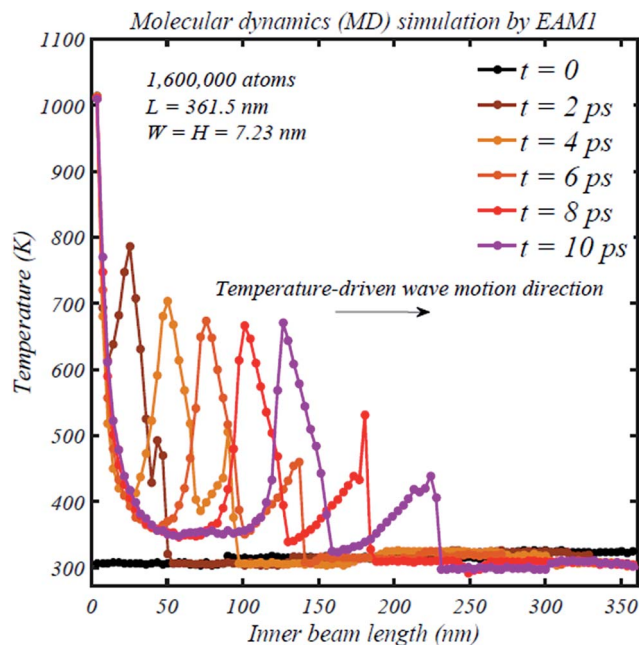
Fig. 9 Evolution of temperature distribution in a nano-slab at different time predicted by MD simulation, which reveals the thermal wave propagation.



Fig. 10 Temperature-driven wave predicted by alternative EAMs (EAM1,[85] EAM2,[86] EAM3,[87] and EAM4).[88]

$$\lambda_q = \tau_q \left( C_{NL\ C-V} - \frac{C_{C-V}^2}{C_{NL\ C-V}} \right) \approx \tau_q \left( C_{MD} - \frac{C_{C-V}^2}{C_{MD}} \right)$$
$$= 5.79 - 7.11 \text{ nm} \qquad (25)$$

where $C_{C-V}$ and $C_{NL\ C-V}$ stand for thermal wave speed predicted by the C–V model and NL C–V models, respectively. The presented MD results in Fig. 9 and 10, similar to those presented for argon thin films[48] and porous materials,[24] show slight temperature rise in atoms (locations) ahead of thermal wavefront which is compatible with the characteristics of thermal wave predicted by the NL FTPL heat conduction presented in Sections 4.1 to 4.3 as well as those observed in ref. 24 for phase-lag heat conduction in homogenous and heterogeneous materials. The observed temperature rise in MD simulation could be damped if the MD simulation time is prolonged. It is worth noting that the lateral boundaries of nano-slab are assumed periodic, which means that the deformation of the nano-slab has been confined.

The superficial temperature computed by eqn (23) does not distinguish between the induced thermal wave (second-sound) and mechanical (sound) wave caused by the generated thermal stress,[84] which can be the reason for two peaks in the MD temperature responses (Fig. 9) a phenomenon previously observed in graphene ribbons pulsed by local heating[16] and argon thin films.[48] The superficial temperature shows a weakly dissipative feature. Consistent with the Monte Carlo simulation implemented in,[13,14] our both MD simulation and NL FTPL continuum heat conduction modelling reveal a finite speed for the temperature-driven wave propagation. To shed lights on the coupling of thermal and mechanical waves in the above-mentioned temperature-driven wave propagation, thermal wave is solely shown in Fig. A1 of Appendix by excluding the mechanical
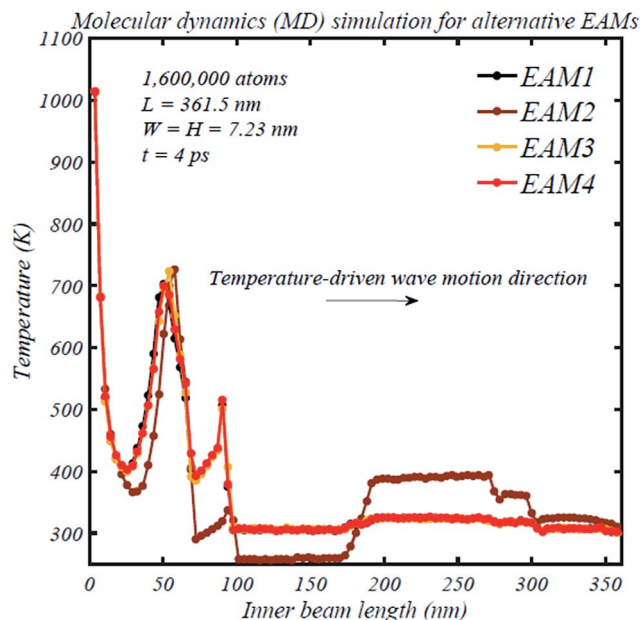
wave caused by thermal expansion induced by temperature rise in the hot zone.

Different interatomic potential can sometimes yield to dissimilar MD results.[89,90] As a result, implementing an appropriate embedded atom model (EAM) is crucial for MD simulation. To confirm the robustness and reliability of thermal wave characteristics observed by MD simulation for the nano/microscale heat transport, thermal results of MD simulation are compared in Fig. 10 for a series of EAM potentials.[85–88] As seen in Fig. 10, all the four tested EAM potentials show the propagation of thermal disturbance through a thermal wave. Similar to Fig. 9, two peaks presented in temperature-driven wave in Fig. 10 are due to the strong coupled thermal and mechanical waves. Except for the EAM2 potential, temperature profiles for all EAM potentials are almost identical. If the mechanical wave due to thermal expansion is removed, only one peak with appears in temperature profile presenting the thermal wave with a lower intensity compared to the temperature-driven wave including the coupled thermal and mechanical waves. As shown in Fig. A2 in Appendix, all four EAM potentials then result in almost the same thermal wave demonstrating that the discrepancy of EAM2 potential in the superficial temperature profile, presented in Fig. 10, emanates from the mechanical wave.

It is important mentioning that EAMs, opposed to Lennard-Jones type potential, consider electron effect in the potential energy. However, EAM potentials do not allow a long-distance transport of electrons, which can affect the heat transport. As an empirical derivation from first-principle methods, the EAM potential considerably improves the computational efficiency for dealing with relatively large-scale systems. To better examine the thermal transport behavior, first-principle methods like density

functional theory (DFT) can be an appropriate alternative to examine in details the role that electrons play in the heat transport within nanoscale metallic materials.

## 5. Concluding remarks

Despite proposed alternative non-Fourier heat conduction theories for multiscale heat transfer analysis, a robust heat conduction model validated by experimental data and molecular dynamics simulation yet to be developed to accurately simulate the propagation of thermal wave in advanced materials. To address this important concern for micro-electromechanical system design and laser-assisted advanced and additive manufacturing, we have introduced a novel nonlocal fractional three-phase-lag (NL FTPL) continuum heat conduction model and corroborated its prediction for thermal wave characteristics with those found by molecular dynamics simulation for nano/microscale heat transfer. The introduced wave-like NL FTPL is a non-Fourier heat conduction model which simultaneously detects thermal wave, removes temperature discontinuity at the wavefront, and incorporate the effects of size-dependency, sub/super diffusion, phonon–electron interaction, and thermal displacement in the ultrafast heat transport. The NL FTPL model considers the effects of size-dependency, subdiffusion or superdiffusion of heat transport, interaction of energy carriers (phonons and electrons), and thermal displacement on ultrafast transient heat transport through the introduction of correlation nonlocal length ($\lambda$), time-fractional derivative ($\alpha_{\mathrm{F}}$), phase-lags of heat flux ($\tau_{\mathrm{q}}$), temperature gradient ($\tau_{\mathrm{T}}$), and thermal displacement ($\tau_{\upsilon}$) into the constitutive heat conduction model.

To reveal the characteristics of thermal wave, semi-analytical solutions have been derived for the heat transport through homogenous and functionally graded nano/microscale one-dimensional slabs on the basis of NL FTPL continuum heat conduction. MD simulation has been implemented to compare the characteristics of thermal wave in continuum and molecular level. The MD simulation confirms the existence of thermal wave in molecular level which can also be traced through the nonlocal heat conduction model (NL FTPL), a phenomenon which requires experimental thermal testing and imaging through high-speed thermal camera to fully characterize the thermal wave specification for a wide range of materials (from metals to biological materials). The comparison of the numerical predictions of MD and nonlocal continuum heat transfer enables us to estimate the correlating length of a nano-scale copper slab as $\lambda_{\mathrm{q}} = 5.79$–$7.11$ nm. A detailed MD simulation, corroborated with experimental data, is needed to quantify accurately the value of correlating length scale required for nonlocal heat conduction analysis. The multiple parameters defined in the proposed NL FTPL continuum heat conduction model not only enable tracking the thermal wave propagation with smooth thermal wavefront, but also potentially facilitate the correlation between experimental data for the ultrafast heat transport and a numerical continuum heat conduction model.

## Appendix

The non-dissipative MD thermal wave by excluding mechanical wave from the temperature-driven wave propagation is shown in Fig. A1. Since the local macroscopic momentum contributes in the superficial temperature, temperature of each segment ($T'_{\mathrm{seg}}$) can be determined by excluding the local macroscopic momentum as:[16]

$$T'_{\mathrm{seg}} = \frac{\sum_i m\left(\vec{v} - \vec{u}\right) \cdot \left(\vec{v} - \vec{u}\right)}{3N_{\mathrm{seg}}k_{\mathrm{B}}} \tag{A1}$$

where $\vec{v}$ is the atom velocity and $\vec{u}$ is the velocity due to the local macroscopic momentum.

## Acknowledgements

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