



## Lattice Vibrations as Design Variables: A Review of Phonon Engineering for Thermomechanical Optimization

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### Article Info

**ISSN (online):** 3049-1215

**Volume:** 02

**Issue:** 05

**September-October 2025**

**Received:** 15-07-2025

**Accepted:** 16-08-2025

**Published:** 10-09-2025

**Page No:** 27-36

### Abstract

Previously thought to have inherent limitations, lattice vibrations are now more often acknowledged as adjustable design factors with significant effects on thermomechanical optimization. The theoretical underpinnings and also scattering mechanisms, and band structure manipulation techniques that allow for the intentional control of phonon activity are summarized in this paper. Supported by computational frameworks and experimental work, the focus is on how phonon engineering mediates trade-offs between mechanical resilience and thermal conductivity. Phonons serve as active degrees of freedom in performance optimization in a variety of applications, including thermo electrics, thermal barrier coatings, alloys for harsh environments, and quantum materials. The review presents phonon engineering as a paradigm poised with transformational potential spanning energy, in the design of advanced material structures, mechanical, and quantum technologies by emphasizing the shift from descriptive to prescriptive control of lattice vibrations.

**DOI:** <https://doi.org/10.54660/IJFEI.2025.2.5.27-36>

**Keywords:** Phonon Engineering, Lattice Vibrations, Thermomechanical Optimization, Advanced Materials

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### 1. Introduction

Phonons also referred to as lattice vibrations have in the past been regarded as fixed constraints used to characterize the mechanical and thermal behaviour of solid materials. However, in recent the years, a different paradigm has now known, which view phonons as controllable design variables rather than as fixed material features. This recent scientific model has emerged as a result of the increasing need to address thermomechanical issues in advanced materials, such as employing quantum materials, where phonon behaviour is crucial for electron–phonon interactions and quantum coherence, improving thermoelectric performance by reducing lattice thermal conductivity and developing alloys that can withstand harsh environment conditions <sup>[1, 2]</sup>.

In phonon engineering, lattice vibrations are deliberately varied through structural, compositional and dimensional modifications. Researchers can carefully control phonon dispersion, scattering, and mean free path using methods such as nanostructuring, isotope substitution, and the creation of phononic crystals and acoustic metamaterials <sup>[3, 4]</sup>. These techniques change the function of phonons from passive restrictions to parameters that can be tuned and optimized to achieve particular functional objectives. The phonon engineering has fast become a major technique for optimizing material performance as phonons are no longer viewed as passive parameters that is fixed but instead as parameters that can be tuned and optimized. This review emphasizes how reimagining phonons as dynamic and programmable entities offers a unified framework. It combines theoretical models, computational methods, and experimental advancements, highlighting the scientific and industrial significance of phonon engineering in microelectronic heat management, thermoelectric energy conversion, and alloy durability

for nuclear and aerospace applications. At the frontier, quantum materials present opportunities to manipulate lattice vibrations for emergent phenomena and next-generation device technologies<sup>[5, 6]</sup>.

## 2. Theoretical Foundation of Phonons Engineering

### 2.1. Quantum-Statistical Origin of Phonons as Collective Excitations and Their Dual Role in Energy and Momentum Transport

The quantization of collective atomic oscillations within a crystal lattice gives rise to phonons, which are defined as the quanta of crystal lattice vibrations<sup>[1]</sup>. These excitations are regarded as bosonic particles that follow the Bose-Einstein distribution from the perspective of quantum statistical mechanics. This conceptualization emphasizes phonons as fundamental excitations that link large-scale transport features with atomic-scale dynamics, rather than as abstract concepts.

Due to their quantum-statistical origin, phonons are inherently associated with energy transmission. The phonon spectrum establishes group velocity, scattering rates and heat capacity; the crucial elements that dictate lattice thermal conductivity<sup>[5]</sup>. Indeed, phonon distribution determines heat storage and transfer, particularly in semiconductors and dielectrics where the majority of thermal energy flow is due to lattice vibrations<sup>[3]</sup>.

The phonons also have role in the conveyance momentum. Their scattering interactions with lattice interfaces, electrons, and defects control the transfer of momentum, influencing damping and deformation behaviour. The limitations of thermal and mechanical transport are established by phonons, which serve as both energy carriers and scattering agents<sup>[4]</sup>. It is therefore worthy to note that phonons have a dual role: enabling heat conduction while regulating mechanical response.

Key phenomena including ultralow thermal conductivity, negative thermal expansion and high-temperature superconductivity are driven by anharmonic lattice vibrations, which control how atoms interact and conduct heat<sup>[2]</sup>.

The theoretical foundation of phonon engineering is provided by these ideas, which collectively place phonons in the context of quantum-statistical collective excitations with combined roles in energy and momentum transport. Researchers can deliberately influence lattice variables to accomplish thermomechanical optimization by using phonons as dynamic design factors rather than passive limits.

### 2.2. Phonon Dispersion as a Design Landscape

The basis of lattice dynamics is phonon dispersion relations, which describe how phonon frequency changes with wave vector. These relations include adjustable parameters such as frequency, group velocity, and mode symmetry; illustrate how vibrations move through a crystal<sup>[1]</sup>. Dispersions are a variable landscape that determines thermal, mechanical, and electrical behavior rather of being fixed attributes. The distribution and interaction of vibrational energy with charge carriers are determined by frequencies. High-frequency optical modes influence scattering and dissipation, whereas low-frequency acoustic modes primarily drive heat conduction<sup>[4]</sup>. Particularly in thermoelectrics, engineering dispersions, like flattening optical branches or expanding band gaps, can reduce heat transmission and increase energy conversion efficiency.

The rate at which energy flows is determined by group velocity, which is indicated by the dispersion curve's slope. In order to attain ultralow conductivity, designed reductions can lessen heat transfer, whereas steeper acoustic branches mean faster conduction<sup>[5]</sup>.

In addition, mode symmetry shapes interactions. It influences energy transfer efficiency by establishing scattering rules for phonon-phonon and phonon-electron processes<sup>[2]</sup>. It is possible to tune mechanical and thermal properties specifically by adjusting symmetry through interfaces, dimensional confinement, or strain.

Frequency, velocity, and symmetry are all manipulable levers in the design map that is phonon dispersion. Similar to how electrons are led in band engineering, phonons can be guided by microstructural and nanoscale engineering, transforming lattice vibrations into active thermomechanical optimization tools.

### 2.3. Coupling of Lattice Vibration with Electronic, Spins and Defects States: Beyond Harmonic Approximations

Phonons, which are the quantized vibrations of the lattice, do not behave in isolation in real materials. Rather, they are always interacting with magnetic spins, electronic states, and crystalline imperfections, which results in a much more complex picture than what is implied by simple harmonic models. With the help of these couplings, phonons are changed from background vibrations to active agents that influence material behavior.

At the core of this complexity are electron-phonon interactions, which dictate the movement of charge carriers, the conductivity of heat and electricity, and even the ability to achieve superconductivity through pairing mechanisms like the Bardeen-Pines interaction<sup>[7, 8]</sup>. Developments in first-principles methods have made it possible to calculate these couplings with remarkable accuracy, predicting carrier mobilities, phonon band corrections, and superconducting critical temperatures<sup>[9]</sup>. Crucially, their function is not limited to metals; recent research has revealed that electron-phonon scattering also shapes thermal transport in semiconductors and insulators by renormalizing phonon lifetimes and frequencies<sup>[10]</sup>.

Spin-phonon interactions bring an additional dimension to material behavior. In magnetic systems, lattice vibrations couple to spin states, shaping relaxation processes, decoherence, and magnetic anisotropy. These effects are especially important for spintronics and quantum devices, where maintaining coherence and information stability is critical. In single-molecule magnets, for example, phonons tune the anisotropy barriers that govern memory retention and quantum tunneling of magnetization<sup>[11]</sup>. With recent advances in *ab initio* methods, researchers can now directly link vibrational damping to spin relaxation, enabling quantitative predictions of magneto-dynamic properties in real materials<sup>[12]</sup>.

Phonon-defect interactions are equally important. Defects, such as dislocations, dopants, or grain boundaries that were once thought to be undesirable scatterers are now acknowledged as design tools. Researchers can reduce lattice thermal conductivity and create high-performance thermal barrier coatings and thermoelectric efficiency by purposefully creating fault landscapes. This change reinterprets flaws as tools for performance optimization and heat control rather than as constraints.

When combined, these couplings demonstrate that phonons play a key role in mediating emergent material features. Phonons actively influence the balance of electrical, thermal, magnetic, and quantum functions outside of the harmonic approximation. Materials scientists are paving the road for a

new generation of optimal materials in which lattice vibrations are programmable design components rather than passive descriptions by learning to manage these interconnected interactions.

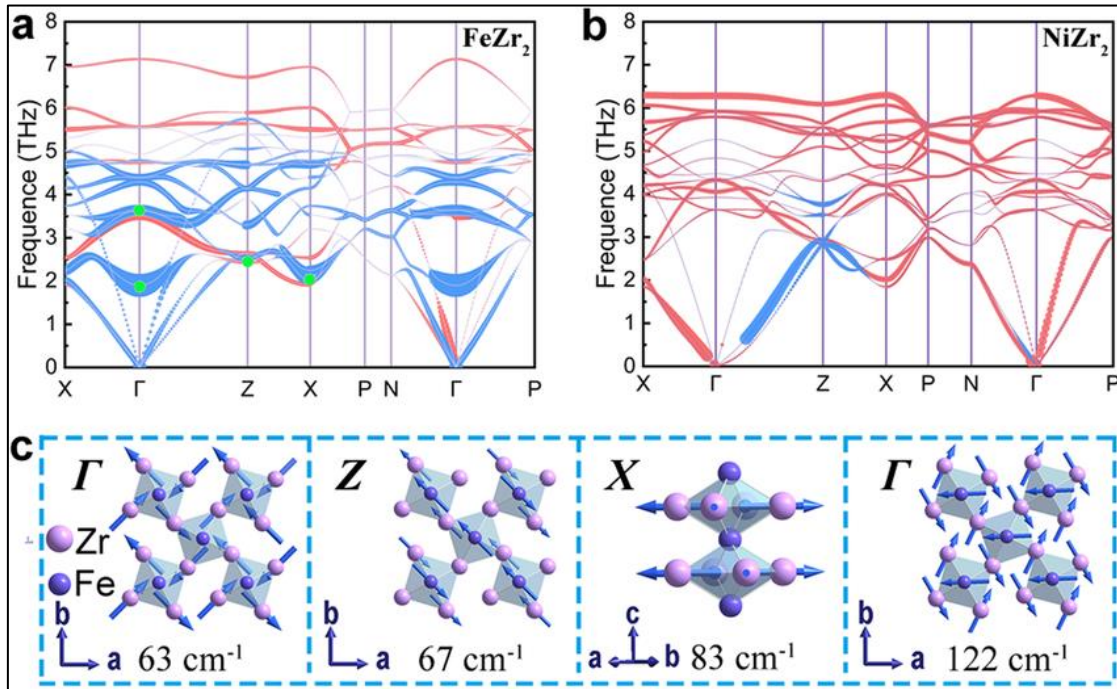


Fig 1: A diagrammatic illustration of Phonon dispersion curves and vibrational modes [64]

### 3. Phonon Scattering Pathways and Their Engineering Levers

#### 3.1. Intrinsic scattering: Anharmonicity, Umklapp processes and Temperature Scaling

In crystalline solids, phonons—quanta of lattice vibrations—transport heat. Since phonons do not interact in an ideal harmonic lattice, thermal conductivity would be infinite. However, real materials are anharmonic: phonons have finite lifetimes due to phonon–phonon interactions introduced by higher-order factors in the lattice potential, which also provide the higher-order terms of heat transfer [13].

Grüneisen's parameter measures anharmonicity:  $\gamma = -\omega/V(\partial V/\partial \omega)$

$V$  = volume of the crystal,  
 $\omega$  = phonon frequency,  
 $\partial\omega/\partial V$  = sensitivity of the frequency to volume change

which measures how phonon frequencies shift with volume. Large values indicate strong scattering and lower thermal conductivity. In graphene, on the other hand, its remarkable thermal conductivity of 2000–5000 W/mK is explained by the weak anharmonicity of flexural (ZA) phonons [1]. Phonon–phonon scattering is caused by Umklapp (U) and Normal (N) processes. Normal processes do not directly oppose heat flow; instead, they conserve momentum within the Brillouin zone. Umklapp processes necessitate subtracting a reciprocal lattice vector because they entail momentum transfer beyond the zone boundary:

$$q_1 + q_2 = q_3 + G$$

which effectively reverses phonon momentum and creates thermal resistance [14]. The rate of Umklapp scattering can be expressed as:

<p><b>Umklapp scattering rate</b></p> $\frac{1}{\tau_U} \propto \gamma^2 \omega^2 T e^{-\Theta_D/bT}$ <p>where:</p> <ul style="list-style-type: none"> <li>• <math>\tau_U</math> = phonon lifetime due to Umklapp scattering,</li> <li>• <math>\gamma</math> = Grüneisen parameter,</li> <li>• <math>\omega</math> = phonon frequency,</li> <li>• <math>T</math> = temperature,</li> <li>• <math>\Theta_D</math> = Debye temperature,</li> <li>• <math>b</math> = constant of order unity.</li> </ul>	<ul style="list-style-type: none"> <li>• <b>Low <math>T \ll \Theta_D</math>:</b></li> </ul> $\kappa \sim T^3$ <ul style="list-style-type: none"> <li>• <b>Phonon lifetime at high <math>T</math>:</b></li> </ul> $\tau \sim \frac{1}{T}$ <ul style="list-style-type: none"> <li>• <b>High <math>T \gg \Theta_D</math>:</b></li> </ul> $\kappa \sim \frac{1}{T}$
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Systems that are low-dimensional and nanostructured diverge from typical bulk patterns. While confinement restricts or creates new scattering channels in nanowires and superlattices, long-lived ZA phonons in graphene delay Umklapp scattering<sup>[15]</sup>. These effects serve as the foundation for phonon engineering, which modifies interfaces, surfaces, and geometry to either promote or reduce inherent scattering. For instance, thermoelectrics benefit from strong anharmonicity to reduce conductivity<sup>[16]</sup>, whereas electronic cooling materials such as graphene and diamond require weak anharmonicity<sup>[17]</sup>.

In short, intrinsic scattering—through anharmonicity, Umklapp processes, and their temperature scaling—defines the fundamental limits of phonon transport and provides the levers for tuning thermal conductivity across materials and technologies.

### 3.2. Extrinsic Scattering: Defect Engineering, Isotopic Substitution, and Nanostructuring

Extrinsic scattering mechanisms have a significant influence on the thermal conductivity of real materials in addition to intrinsic phonon–phonon scattering. Imperfections, compositional changes, and designed features that interfere with the lattice's ideal periodicity are the causes of these. A versatile set of tools for controlling phonon transport in bulk and low-dimensional systems is provided by extrinsic scattering, which can be deliberately tuned through defect engineering, isotopic substitution, and nanostructuring, in contrast to intrinsic effects, which are determined by fundamental anharmonicity<sup>[1, 15]</sup>.

Defect engineering provides a straightforward way to control phonon scattering. Point defects—such as vacancies, interstitial atoms, or substitutional impurities—create local mass and strain variations that disrupt phonon movement, with the strongest influence on short-wavelength, high-frequency phonons. On the other hand, extended defects like dislocations, stacking faults, and grain boundaries primarily affect long-wavelength acoustic phonons by shortening their mean free paths. In thermoelectric materials, carefully introducing defects has long been used to reduce lattice thermal conductivity while preserving good electrical performance<sup>[16]</sup>. A notable example is PbTe-based alloys, where intentional defect incorporation has driven lattice conductivity to exceptionally low values, showcasing how defect engineering can be harnessed for energy applications. One of the most effective ways to control phonon scattering is through defect engineering. Point defects—such as vacancies, interstitials, or substitutional atoms—disturb the uniformity of the lattice by introducing local mass and strain variations. These disruptions mainly hinder the flow of short-wavelength, high-frequency phonons. Extended defects like dislocations, stacking faults, and grain boundaries, on the other hand, scatter long-wavelength acoustic phonons and shorten their mean free paths. In thermoelectric materials, introducing defects in a controlled manner has proven to be a reliable way of lowering lattice thermal conductivity without severely affecting electrical properties<sup>[16]</sup>. For instance, in PbTe-based compounds, deliberate alloying and defect introduction have achieved record-low lattice conductivity, showing how phonon scattering can be tuned to enhance energy performance.

Defect engineering, isotope substitution, and nanostructuring together show how extrinsic scattering can be used to adjust phonon transport across orders of magnitude. These methods

lie at the heart of modern phonon engineering, making it possible to achieve extremely low thermal conductivity in thermoelectrics for efficient energy conversion, and, conversely, exceptionally high conductivity in isotopically pure crystals for applications in electronics cooling and thermal management.

### 3.3. Coherent vs. Incoherent Scattering Regimes in Nanoscale Architectures

The way phonons interact with structural features like interfaces and superlattices determines whether phonon transport in nanoscale materials follows a coherent or incoherent regime.

In the coherent regime, phonons retain their phase information and propagate as waves. This coherence enables phenomena such as interference, band folding, and the emergence of phonon bandgaps, analogous to optical effects in photonic crystals. Ordered superlattices and phononic crystals serve as prime examples, where lattice periodicity alters phonon dispersion and selectively suppresses heat-carrying modes<sup>[1, 18]</sup>.

In contrast, the incoherent regime arises when phase coherence is disrupted by interface roughness, structural disorder, or strong scattering. Under these conditions, phonons behave more like classical particles, and transport is described statistically through scattering rates and mean free paths. In systems such as disordered multilayers or nanocomposites, incoherent scattering dominates, with models like the diffuse mismatch model (DMM) frequently employed to capture transport behavior<sup>[17]</sup>.

In reality, most materials display a crossover between coherent and incoherent phonon transport. At low temperatures, the longer wavelengths of phonons enhance coherence, while at higher temperatures, stronger scattering shifts transport toward the incoherent regime. The outcome is strongly dependent on interface quality and structural dimensions: epitaxial superlattices can maintain coherence across several layers, whereas rough or polycrystalline structures tend to scatter incoherently<sup>[15]</sup>.

Tuning this balance is a core principle of phonon engineering. Coherent effects enable tailored control of phonon spectra to minimize thermal conductivity in thermo electrics, whereas incoherent scattering offers a more practical means of reducing heat flow through disorder. Both regimes are strategically leveraged in nanoscale thermal management.

## 4. Phonon Band Structure Manipulation as a Design Strategy

### 4.1. Strain Engineering and Symmetry Breaking as Methods for Phonon Mode Softening/Hardening

A material's thermal, electrical, and optical behaviours are largely determined by its phonons, which are the quanta of lattice vibrations. By altering the lattice either internally or externally, their frequencies and lifetimes can be adjusted. Strain engineering and symmetry breaking, which directly alter the phonon dispersion relations and scattering paths, are among the most effective strategies for modifying phonon modes.

Strain engineering modifies interatomic distances and bond strengths by compressing or stretching the atomic lattice. Bond stiffness is usually decreased by tensile strain, which lowers the vibrational frequency of specific modes—a process known as phonon softening. Conversely, phonon hardening may result from stiffening bonds due to

compressive strain. For instance, controlled strain in graphene and related two-dimensional crystals can alter the Grüneisen parameters, change thermal conductivity by either promoting or lowering the phonon scattering, and shift the frequencies of acoustic and optical branches <sup>[1]</sup>. This tunability is essential in thermoelectric materials because softer phonon modes enhance phonon–phonon interactions, which lowers lattice thermal conductivity and increases efficiency <sup>[19]</sup>.

Symmetry breaking adds an additional layer of control. The stringent selection rules obeyed by perfect crystals determine which phonon scattering processes that will be allowed. New scattering channels open up in a situation whereby the symmetry is broken through defects, alloying, heterostructure formation, or dimensional confinement. Out-of-plane acoustic (ZA) modes are one example of a three-phonon process that is prohibited by the mirror symmetry of pristine graphene. Thermal conductivity is reduced and scattering is enhanced when this symmetry is broken, for example, by strain gradients or substrate interaction <sup>[5]</sup>. High thermal conductivity and coherent phonon transport are made possible by purposefully preserving or creating specific broken symmetries in superlattices, which can confine optical phonons or produce bandgaps that harden selected modes <sup>[1, 5]</sup>.

Strain engineering and symmetry breaking work hand in hand as powerful tools to fine-tune phonon behavior in materials. Strain adjusts phonon frequencies in a smooth and continuous way, shifting them between softer and stiffer modes, while symmetry breaking changes the rules of scattering and influences how long phonons can live. When these two strategies are combined, they open the door to creating materials with remarkable thermal properties—ranging from very low conductivity, useful in thermoelectrics and thermal insulation, to extremely high conductivity for efficient heat dissipation. This flexibility captures the core idea of modern phonon engineering: treating vibrations not as mere background effects, but as key design elements for advancing energy and electronic technologies.

#### 4.2. Superlattice and Heterostructure Phononics: Bandgap Opening and Phonon Localization

The design of superlattices and heterostructures is one of the most fascinating areas of phonon engineering in solid-state physics. These artificial structures has given rise to the phenomena of phononic bandgap opening and phonon localization by enabling us to manipulate phonons in ways that are not possible in natural crystals. Many developments in thermoelectrics, thermal insulation, and nanoscale heat management are based on these two effects, which are essential for regulating thermal transport.

A periodic stacking of two or more distinct materials, frequently at nanoscales, is called a superlattice. Brillouin zone folding and the appearance of mini-bands and bandgaps in the phonon dispersion are caused by this periodic modulation of mass density and elastic properties <sup>[1]</sup>. To put it another way, just as electronic bandgaps limit electron transport in semiconductors, specific phonon frequency ranges are prohibited from propagating. As a result, thermal conductivity can be effectively suppressed while preserving desired electrical or optical properties, which is a crucial design principle in thermoelectric devices <sup>[19]</sup>.

Phonons govern a material's thermal and electronic properties, and their behavior can be tuned through strain

engineering and symmetry breaking. Strain modifies bond stiffness, leading to phonon softening or hardening and influencing conductivity in systems like graphene and thermoelectric <sup>[1, 19]</sup>. Symmetry breaking, caused by defects, confinement, or substrate effects, opens new scattering channels and reshapes transport pathways <sup>[5]</sup>. Together, these strategies provide complementary control over phonon lifetimes and frequencies, enabling materials with tailored heat transport for energy and electronic technologies <sup>[1, 5]</sup>.

#### 4.3. Topological Phononics: Emergence of Protected Edge Modes for Robust Transport Properties

Topological phononics redefines the role of lattice vibrations by showing that phonons can carry energy through rather than acting only as ordinary heat carriers. When symmetry-breaking patterns are built into phononic crystals—through tailored geometries or structured interfaces—they open protected edge modes bandgaps that support edge vibrations resistant to scattering <sup>[20]</sup>. Much like in the quantum spin Hall effect, these helical edge states let phonons move past defects and sharp corners without reflection <sup>[21]</sup>.

This idea extends beyond 2D systems: one-dimensional SSH-type chains also enable localized edge modes for directing vibrations <sup>[22]</sup>. Similarly, optomechanical arrays have achieved protected phonon transport, with large-scale experiments directly observing vibrations traveling along stable edge channels <sup>[23]</sup>. Even more recently, second-order topological insulators in phononics have uncovered corner-bound states, adding new design opportunities <sup>[24]</sup>.

Together, these breakthroughs show that topological phononics offers robust phonon pathways, scalable design control, and a platform for next-generation devices—from nanoscale heat guides to acoustic circuits and quantum technologies.

#### 5. Thermomechanical Optimization via Phonon Control

In lattice dynamics and mechanics, designing materials that endure stress and distribute, steer, or suppress heat at the same time is a linked challenge. Through their spectra and scattering phase space, phonons control lattice heat conductivity, expressed as kappa ( $\kappa$ ). Elastic moduli, hardness, creep, and fracture reaction are likewise determined by the same bonding topology and defect populations that customize phonon transport. Therefore, rather than focusing only on reducing kappa ( $\kappa$ ), a thorough optimization views phonon control as a lever on both heat flow and load-bearing capacity.

Callaway-Klemens transport can be used to frame the phonon contribution to heat flow in crystalline solids: the majority of heat is carried by acoustic modes with high group velocities, including point-defect, mass-disorder, boundary, and anharmonic modes. The mean-free-path spectrum, represented by  $\Lambda(\omega)$ , and hence kappa ( $\kappa$ ), was restricted by Umklapp scattering <sup>[25–27]</sup>. Lower bounds become closer to the "minimum" or amorphous limit, where propagons are extinguished and diffusons predominate <sup>[28]</sup>. Soft modes, strong anharmonicity, and high mass/strain disorder are mechanisms that push toward this limit, but they can also embrittle the lattice, change yield paths, or lessen stiffness. Accordingly, a successful design:

1. suppresses heat-carrying modes throughout pertinent frequency–wavevector ( $\omega$ – $q$ ) sectors and the same time
2. maintaining microstructural properties (grain size, twin density, constraint designs) that sustain modulus and

hardness as well as load-bearing covalency/ionicity.

kappa ( $\kappa$ ) considerably below the alloy limit while maintaining the in-plane elastic response that is primarily inherited from the stiff elements<sup>[29]</sup>. Interfaces must also be designed for shear transfer and delamination resistance for structural duty; this is perfect for microelectronic heat management at moments where mechanical stresses are low.

### Boundary and Size Effects

By using boundary scattering and surface roughness, nanowires and nano meshes truncate Lambda ( $\Lambda$ ); at room temperature, rough silicon nanowires reach kappa ( $\kappa$ )  $\approx$  1–2  $\text{W m}^{-1} \text{K}^{-1}$ <sup>[30, 31]</sup>. The mechanical consequences depend on the statistics of flaws: architectural composites (e.g., nanolaminates that have compliant interlayers) would naturally decouple effects like this by adopting a scheme where geometry is used to carry load while keeping phonon mean-free-path spectra relatively short.

### Point-defect and mass-disorder scattering.

Research has shown that high densities of free oxygen and cation have an ability to cause structural disordering and also flatten and localize vibrational eigenmodes in fluorite-derived oxides (yttria-stabilized zirconia, rare-earth zirconates), producing ultralow kappa ( $\kappa$ ) at high temperatures that are almost temperature-independent<sup>[32, 33]</sup>. Crucially, the same solid-solution disorder offers classical solution strengthening: with proper dopant size/valence and phase stability management, hardness and modulus are maintained or even slightly augmented<sup>[34]</sup>.

### Configurational disorder in ultra-high-temperature ceramics (UHTCs).

In high-entropy carbides and borides it has also been noted that strong, short metal–carbon/boron (M–C/B) covalent bonds maintain high elastic moduli and hardness, but multi-principal cation sublattices create huge mass and strain field fluctuations that significantly broaden phonon scattering. An uncommon coupling of low thermal transport with superhardness is demonstrated by representative high-entropy carbide (ZHC-1) with room-temperature kappa ( $\kappa$ ) = 15  $\text{W m}^{-1} \text{K}^{-1}$ , nanoindentation hardness  $\approx$  30 GPa, and elastic modulus  $\approx$  460 GPa<sup>[38]</sup>.

### Amorphous or glass-ceramic routes near the minimum-kappa ( $\kappa$ ) limit.

The use of topologically disfigured networks and nano dispersed free-carbon phases known to localize vibrational modes, silicon oxycarbide (SiOC) glasses and SiOC-based composites reach kappa ( $\kappa$ )  $\approx$  1–2  $\text{W m}^{-1} \text{K}^{-1}$  at ambient temperature<sup>[35]</sup>. A careful control of the carbon content and pyrolysis atmosphere results in hardness  $\approx$  8–12 GPa and modulus in the range of 60–100 GPa, which is sufficient for a wide range of thermal-protection systems and architected lattices, even if totally amorphous networks reduce elastic modulus in comparison to dense covalent ceramics<sup>[36, 37]</sup>.

### Design rules for balancing heat and load.

Instead of softening everything, target mode-selective suppression. High-velocity acoustic channels can be eliminated while maintaining stiff bonding in load-bearing directions by using band-structure engineering techniques (superlattice minibands, mass-disorder scattering).

Exploit dis configurations that rely on bond-driven stiffness. In covalent ceramics, M–X networks ( $X = \text{C, N, B, O}$ ) preserve high elastic modulus and hardness even when mass/strain disorder drastically reduces kappa ( $\kappa$ ). High-entropy design is a particularly successful instantiation.

Make technical and improvised use of amorphization. Heat shielding and thermal shock mitigation can be achieved by approaching the minimum-kappa ( $\kappa$ ) limit through amorphous states; for structural demands, architected metamaterials (such SiOC lattices) can restore particular stiffness at low kappa ( $\kappa$ ).

To share functions, architects create interfaces. Use compliant or graded layers to transmit shear and reduce delamination in situations where phonon lever is only interfacial (superlattice, multilayers, etc.), preserving mechanical integrity under heat cycling.

### Implications for design under extreme environments

If thermal expansion coefficient matching and sintering resistance are controlled, defect-engineered fluorites and pyrochlores offer a reliable route to low kappa ( $\kappa$ ) for hot-section coatings and thermal-protection systems without compromising stiffness. High-entropy ultra-high-temperature ceramics are a unique combination of low or moderate kappa ( $\kappa$ ) and super hardness, which shifts the Pareto frontier for structural ceramics operating at high heat flux. Superlattices use coherent/incoherent crossover to reduce cross-plane transport without lowering the constituent crystals' elastic constants, which is useful for the management of micro-/nano electronic heat in situations with moderate loads but high temperature gradients<sup>[29]</sup>. Finally, geometry restores particular stiffness while architected amorphous ceramics allow for near-minimum kappa ( $\kappa$ ).

## 6. Computational and Experimental Frameworks for Phonon Design

Methodological frameworks that connect experimental verification, materials screening, and predictive modeling are necessary to lead the evolution of phonon engineering from a mere ideological concept to real-world application. Phonon-centered design necessitates anticipatory methods that can resolve the problems of lattice dynamics and their attendant thermomechanical consequences across several scales, in contrast to classical materials optimization, where emergent features are defined post-synthesis. Lattice vibrations can now be viewed as manipulable design inputs rather than descriptive signatures because of the convergence of first-principles theory, machine learning, and high-resolution experimental probes.

### 6.1. First-Principles Lattice Dynamics and Anharmonic Phonon Calculations

Phonon modeling is still based on density functional theory (DFT) and other subfields of it. The foundation for phonon transport analysis is established by the dispersion relations and density-of-states predictions provided by harmonic lattice dynamics, which are obtained from force-constant computations.<sup>[39]</sup> However, solely harmonic frameworks are unable to capture the anharmonic phenomena that dominate thermomechanical behavior, such as frequency renormalizations, lifespan reductions, and phonon–phonon scattering.

Thermal conductivity decreases and phonon lifetimes can be

quantitatively accessed by methods like the self-consistent phonon technique and disruptive solutions to the Boltzmann transport equation (BTE) <sup>[40, 41]</sup>. Molecular dynamics using Green-Kubo formalism or interatomic potentials gotten from machine learning have been crucial for capturing nonperturbative phonon–phonon interactions in strongly anharmonic and high-temperature systems <sup>[42]</sup>. When combined, these computational platforms enable the projection of phonon dispersions as adjustable landscapes that are responsive to strain, alloying, and nano structuring, rather than just as static descriptions.

### 6.2. Machine Learning and High-Throughput Screening

Machine learning (ML) has become a supplementary accelerator as one of the leading drivers of phonon engineering as it grows, encompassing heterostructures, isotope replacements, and defect chemistries. To create surrogate models that can predict thermal transport coefficients, vibrational spectra, scattering rates, and with orders of magnitude faster throughput, data-driven techniques make use of pre-existing phonon databases and first-principles outputs <sup>[43]</sup>. Importantly, machine learning enables inverse design, which back-propagates to lattice-level design principles while focusing on certain thermomechanical performance measures (such as ultra-low  $\kappa$  for thermoelectrics and enhanced stiffness for superhard alloys) <sup>[44]</sup>. Phonon–property correlations across hundreds of candidate compounds are increasingly being mapped using high-throughput screening workflows that combine DFT with ML predictors <sup>[45]</sup>. These techniques allow for the quick down-selection of potential material systems before synthesis, converting phonon engineering from a preliminary technique to a methodical design approach.

### 6.3. Experimental Spectroscopies as Validation Platforms

It is necessary to verify computational predictions using experimental probes that can precisely resolve vibrational dynamics both temporally and spectrally. For thorough phonon dispersion measurements, especially for bulk systems, inelastic neutron scattering (INS) is still the gold standard <sup>[46]</sup>. By taking note of occurrences like frequency shifts under strain or disorder, Raman spectroscopy and inelastic x-ray scattering broaden the scope of application to thin films and nanostructured systems <sup>[47]</sup>. In order to differentiate between coherent and incoherent scattering regimes, ultrafast pump-probe techniques offer direct access to phonon lifetimes and coherence <sup>[48]</sup>. Atomic-scale vibrations and mesoscale heat transport can now be better understood because of recent developments in four-dimensional ultrafast electron microscopy, which simultaneously provide temporal, spatial and momentum resolution <sup>[49]</sup>. Crucially, these spectroscopies don't work in a vacuum; instead, they transmit differences back into computer models, closing the design loop and improving interatomic potentials and prediction precision.

### Integrative Frameworks

This pipeline turns phonon engineering into a prescriptive discipline: rather than characterizing lattice vibrations post hoc, researchers can prescribe vibrational spectra and scattering landscapes to achieve target thermomechanical outcomes. This leads to a superior coherence between theory and practice, and possibly and industry where lattice vibrations are no longer observational fields and materials but

design alternatives and tools actively embedded in materials engineering framework. The true power of these tools lies not in their individual capacities but in their integration into iterative feedback loops.

## 7. Frontiers in Application: From Thermoelectrics to Quantum Materials

Once mostly limited to theoretical concepts, phonon engineering is increasingly influencing a variety of application areas. From gradual optimization, the ability to modify lattice vibrations has evolved into a paradigm that actively determines material performance across a variety of functional classes. The scope of this frontier is demonstrated by the following applications.

### Thermoelectrics: Pushing the ZT Boundary

The delicate balance that exists between heat and electrical transport is best exemplified by thermoelectric materials. When phonon scattering reduces thermal conductivity without compromising carrier mobility, the figure of merit, ZT, improves. Recent developments show that lattice thermal conductivity can be greatly reduced while maintaining advantageous electronic transport properties by adopting nanoscale designs that can improve phonon boundary scattering. In certain half-Heusler systems and SnSe derivatives, strategies including hierarchical structure, then also defect clustering, and alloy disorder have combined to push ZT values above the established threshold of 2.0 <sup>[50–52]</sup>. This illustrates how phonons are now operational levers useful for the optimization of energy conversion efficiency rather than passive energy carriers.

### Thermal Barrier Coatings: Extending Lifetime in Harsh Environments

Thermal barrier coatings (TBCs) for gas turbines and aircraft engines rely heavily on vibrational characteristics. In order to improve thermal shock resistance, phonon scattering in controlled environments has been deployed to reduce thermal conductivity in complex oxides and rare-earth zirconates. These novel materials make use of anharmonic lattice dynamics, which inhibit phonon-mean free pathways under extreme circumstances, in contrast to traditional yttria-stabilized zirconia. Furthermore, it has been demonstrated that phonon band flattening through cation substitution increases coating lifetimes by reducing stress accumulation brought on by thermal cycling <sup>[53, 54]</sup>. In this regard, coatings can withstand greater operating temperatures thanks to phonon-informed design, pushing the boundaries of propulsion system efficiency.

### Quantum Materials: Vibrations as Active Degrees of Freedom

Emergent states are mediated by phonons interacting with orbital excitations, charge and spin in quantum-confined and strongly correlated systems. Furthermore, this is useful in states of unconventional superconductivity. In these states, lattice vibrations merge with electronic instabilities to improve transition temperatures, phonon-driven pairing mechanisms have been implicated <sup>[55, 56]</sup>. In addition to superconductivity, artificial phonon modes are becoming more widely accepted as topological state of matter control parameters. Topological phononics, for example, facilitates dissipationless vibrational transport by utilizing symmetry-protected edge states that are resilient to scattering <sup>[57]</sup>. These

discoveries transform phonons from background noise into quantum degrees of freedom that are active and that can direct the functions of materials.

### Extreme Environment Alloys: Resilience Through Vibrational Design

Resilience beyond traditional alloying is required for structural materials used in nuclear reactors, space exploration, and also finds utility in high-pressure energy systems. Phonon engineering provides a thermomechanical foundation in this case. The presence of lattice anharmonicity and chemical disorder in high-entropy alloys (HEAs) promotes phonon scattering, which reduces heat and increases toughness. According to studies, under high temperature and irradiation circumstances, adjusting vibrational entropy directly adds to phase stability and defect tolerance [58, 59]. These vibrational stabilizing processes indicate that alloy design guided by phonons is important for both structural strength and durability in states of non-equilibrium loads and transport optimization.

### 8. Conclusion

The long-held belief that lattice vibrations are unchangeable limitations on material performance has been significantly challenged by the advent of phonon engineering as a novel paradigm in design and material sciences. Rethinking phonons as active degrees of freedom allows for the systematic tuning of thermomechanical properties in a variety of material classes, including high-entropy alloys, quantum matter, thermo electrics, and ceramics. The transition from design models that are inherently descriptive of thermal behaviour and vibrational properties to prescriptive control schemes that use phonons as key design factors represents a larger change in materials science that is reflected in this change.

As was seen in the previous sections, phonon manipulation applies to many length scales and techniques, such as defect-driven vibrational control, scattering pathway modification, and dispersion tailoring. In addition to suppressing heat conduction in thermo electrics, these techniques also improve mechanical toughness in alloys subjected to harsh environments, stabilize metastable phases, and trigger emergent phenomena in correlated electron systems. These results' convergence highlights how lattice vibration control can be used as a cross-disciplinary framework for material optimization.

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In the future, the findings of phonon-engineered materials are probably going to be accelerated by the combination of sophisticated computational techniques with high-throughput experiments. Non-intuitive design criteria that go beyond standard heuristics are already being revealed by machine learning models trained on massive datasets to execute phonon dispersion and defect-vibration interactions.

Meanwhile, more accurate methods of mapping phonon dynamics under operational settings are made possible by experimental advancements in inelastic scattering and ultrafast spectroscopy [60, 61]. When taken as a whole, these advancements create a tight feedback loop in which empirical validation and predictive design support one another, decreasing the gap between theoretical idea and technological implementation.

To sum up, phonon engineering has the potential to revolutionize the field of materials design. It provides a unifying paradigm for thermomechanical optimization across seemingly diverse material classes by converting lattice vibrations from passive restrictions into customizable design features. This conceptual change implies that the ability to precisely shape their phononic landscapes will be used to evaluate future generations of advanced materials in addition to their electronic or structural characteristics.

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