

Imaging beyond the surface region: Probing hidden materials via atomic force microscopy

Farokh Payam, A., & Passian, A. (2023). Imaging beyond the surface region: Probing hidden materials via atomic force microscopy. *Science Advances*, *9*(26), 1-18. https://doi.org/10.1126/sciadv.adg8292

Link to publication record in Ulster University Research Portal

Published in: Science Advances

Publication Status: Published (in print/issue): 28/06/2023

DOI: 10.1126/sciadv.adg8292

Document Version

Publisher's PDF, also known as Version of record

General rights

Copyright for the publications made accessible via Ulster University's Research Portal is retained by the author(s) and / or other copyright owners and it is a condition of accessing these publications that users recognise and abide by the legal requirements associated with these rights.

Take down policy

The Research Portal is Ulster University's institutional repository that provides access to Ulster's research outputs. Every effort has been made to ensure that content in the Research Portal does not infringe any person's rights, or applicable UK laws. If you discover content in the Research Portal that you believe breaches copyright or violates any law, please contact pure-support@ulster.ac.uk.

OPTICS

Imaging beyond the surface region: Probing hidden materials via atomic force microscopy

Amir Farokh Payam¹* and Ali Passian²*

Probing material properties at surfaces down to the single-particle scale of atoms and molecules has been achieved, but high-resolution subsurface imaging remains a nanometrology challenge due to electromagnetic and acoustic dispersion and diffraction. The atomically sharp probe used in scanning probe microscopy (SPM) has broken these limits at surfaces. Subsurface imaging is possible under certain physical, chemical, electrical, and thermal gradients present in the material. Of all the SPM techniques, atomic force microscopy has entertained unique opportunities for nondestructive and label-free measurements. Here, we explore the physics of the subsurface imaging problem and the emerging solutions that offer exceptional potential for visualization. We discuss materials science, electronics, biology, polymer and composite sciences, and emerging quantum sensing and quantum bio-imaging applications. The perspectives and prospects of subsurface techniques are presented to stimulate further work toward enabling noninvasive high spatial and spectral resolution investigation of materials including meta- and quantum materials.

INTRODUCTION

Measuring the subsurface domain presents an inverse and often nonlinear problem. Therefore, to obtain any information on the interior of a material nondestructively, one can only make an analytical or statistical inference of the features that caused the signal. However, the minimally invasive, label-free, nanoscale characterization of the inner structures, interfaces, and organization of two-dimensional (2D) materials (e.g., graphene), quantum materials (e.g., complex oxides), topological (e.g., bismuth selenide), Perovskite (e.g., methylammonium lead halide), bandgap materials (e.g., photonic crystals and multilayers), plasmonic [e.g., core-shell nanoparticles (NPs)], and metamaterials (e.g., cloaking devices) is essential. Optical, confocal, transmission electron, and near-field scanning optical microscopies (1-5) have been proposed and used in applications such as molecular biology (6, 7), toxicity (8), polymer and composite science (9, 10), multilayer high-integration chips, and multicomponent semiconductor device fabrication (11, 12). However, classical diffraction at increasingly smaller length scales, limits the conventional imaging of buried structures with nondestructive excitations, such as low-intensity light and acoustic waves (13-15). Although electron microscopy can provide nanoscale resolution (2, 16), irradiation damage to the sample, especially for biological and organic composite materials, can be a problem. Scanning probe microscopy (SPM) can be a remarkable candidate for tackling forward and inverse subsurface problems. The advanced mechatronics of SPM probes, and the ability to functionalize the probe tips, make the herein-discussed modalities highly relevant to the creation and control of interfacial photonic and semiconductor qubits, and quasiparticles such as polaritons and skyrmions. Here, our goal is to survey the measurement modalities of potential for studying hidden materials (Fig. 1).

MOTIVATION

Quantitative microscopy of materials beyond their bounding surfaces (17) aims to explore two general features: (i) morphological characteristics, e.g., organization, distribution, order, and arrangement of subsurface interfaces and boundaries such as a cell's nuclear membrane (18), and (ii) the chemical and physical properties of the enclosed materials such as the elasticity of chromosomes (18). Understanding these features and their functional properties in performances of pristine materials and in operando devices has enabled recent discoveries in, for example, strain-tuned electronics (19), photo-capacitive/photo-faradic bioelectronics (20), and additively manufactured polymers and composites (21). In semiconductor science and technology alone, controlling the shape and order of materials (22), detection of defects such as buried voids and delamination or leakage for failure analysis (23), and mapping the scattering patterns around the defects and impurities (24) are all use-cases for subsurface nanometrology. For example, the positioning of dopant atoms and roughness of material layers-a hidden morphology attribute-can affect interactions with photons, phonons, and electrons, ultimately determining the functionality of semiconductor devices such as the electrical behavior of transistors. In 3D organic integrated circuits, which incorporate interconnect among the layers, confirming reliable metal connections at different layers is demanded (11). To optimize the integrated circuits and quantum devices, subsurface investigation of the charge carriers and their energy levels at interfaces of organic semiconductors and electrodes (22) is needed. Other use cases include the study of scattering and optical topological transitions occurring in layered metal-dielectric structures and nanowire arrays fabricated by hyperbolic metamaterials (25). Similarly, to detect defects in superconductors (24), probing the Fermi sheets from differential conductance maps is needed.

To fabricate micro/nanoelectromechanical systems, imaging of the group of ions, clusters, lattice defects, and crystal grains is necessary to reduce the pattern size and predict and avoid the failure mechanisms including stiction, wear, fracture, and fatigue. To



Copyright © 2023 1 Authors, some rights reserved; exclusive licensee American Association for the Advancement of Science. No claim to original U.S. Government Works. Distributed under a Creative Commons Attribution License 4.0 (CC BY).

¹Nanotechnology and Integrated Bioengineering Centre, School of Engineering, Ulster University, Belfast, UK. ²Quantum Computing and Sensing, Oak Ridge National Laboratory, Oak Ridge, TN 37830, USA.

^{*}Corresponding author. Email: a.farokh-payam@ulster.ac.uk (A.F.P.); passianan@ ornl.gov (A.P.)



Fig. 1. Subsurface physics. Top: Timeline of key inventions in subsurface force microscopy (FM): atomic FM (AFM), ultrasonic FM (UFM), force modulation microscopy (FMM), heterodyne FM (HFM), ultrasonic AFM (UAFM), atomic force acoustic microscopy (AFAM), electrostatic FM (EFM), magnetic FM (MFM), scanning near-field ultrasonic holography (SNFUH), mode-synthesizing AFM (MSAFM), scanning microwave microscopy (SMM), contact resonance AFM (CR-AFM), scanning thermal microscopy (STM), kelvin probe FM (KPFM), amplitude modulation AFM (AM-AFM), intermittent contact resonance AFM (ICR-AFM), scanning thermoelectric microscopy (STM), and scanning thermal noise microscopy (STNM). Middle: Schematic modalities where a probe (*p*), a sample (*s*), or both are excited by signals *S* of amplitudes *a* and adjustable frequency ω contents or coupled with specific properties of a specimen (e.g., photothermal or photoacoustic excitation by a photon of energy *h*υ). Bottom: Main equations describing the states (I to IV) of the probe and/or the sample, and their mechanical contact (V).

enhance the efficiency and stability of graphene-based devices, the characterization of buried interfaces is needed (24).

In biology, exploring the interior of a cell or tissue is of great importance to elucidate the fundamental mechanism of cell functions and diseases as well as for studying the effects of nanomaterials on biological systems (26, 27). Identification of NPs embedded into cells and other biological materials has extensive applications in drug delivery (28), dental materials (29), contrast agents of magnetic resonance imaging (30), and cancer treatment (31).

The combination of polymeric matrix and nanomaterials creates nanocomposites that exhibit enhanced mechanical strength, thermal and electrical conductivities, stiffness, and toughness. The dispersion mechanism and the distribution of NPs within polymer components affect the morphology and interfacial properties of produced composites. Carbon nanotubes (CNTs) (32, 33), graphene (34), nanocellulose (35), and clays (36) have all been used as fillers in composite technologies, which could lead to the dispersion of several phases inside the matrix, altering the nanocomposite properties (37). If the fillers, in an aggregated phase, failed to bond to the matrix or if a failure occurs in the reinforcing phase when bonding appropriately with the matrix is required, then the composite fails to achieve the optimal design properties. Typically, a layer of polymer covers the filler phases, making an evaluation, using conventional surface imaging techniques, difficult. For example, to improve the performance of CNT nanocomposites, the 3D material morphology of CNTs in a polymer matrix is needed to study the process-structure-properties relationships.

SPM SUBSURFACE PHYSICS AND MEASUREMENT TECHNIQUES

In basic SPM, a probe at a distance $d \gg a_0$ is brought into the nanomechanical regime of a specimen where it interacts with the surface via attractive ($d \ge a_0$) and repulsive ($d < a_0$) forces. Here, a_0 denotes an appropriate interatomic distance (~Å, e.g., 1.54 Å for carboncarbon bond length) (Fig. 1). In practice, this interaction picture is modified in the presence of other nanoscale phenomena, e.g., due to electrostatic, hydration, and ionic interference. Both the probe and the specimen may be excited and, from the collective input stimuli, the nonlinear probe-sample force (F_{ps}) synthesizes additional modes that carry subsurface information. Depending on the operational mode, and the excitation-detection mechanisms, the techniques explored for subsurface visualization may be classified into six groups. These consist of mechanical, electrostatic, magnetic, electromagnetic, and thermal excitation of the probe, the sample, or both (Table 1), and the force-distance approaches (Fig. 1). The merits (including weaknesses and strengths), applications, and basic equations of these force microscopy (FM) modalities are presented in tables S1 and S2 and Fig. 1, respectively.

In the equation panel of Fig. 1, vectors $\boldsymbol{u} = (u, v, w)$ and $\boldsymbol{\sigma}$ denote the displacement and stress fields, respectively, within a sample or a probe (with density ρ) that is subjected to a volume force F and a general damping $\boldsymbol{\Gamma}$. The solution of the (Navier) equation of motion (Eq. I.1) yields the system's mechanical state. The strain field $\boldsymbol{\varepsilon}$ is proportional to $\boldsymbol{\sigma}$ via the material properties of domain D given by tensor c_D (e.g., with components proportional to Young's modulus E). When possible, Eq. I.1 could be simplified for a probe with a beam shape (having a second moment of area I). The temperature of a domain with heat capacity C_D , thermal conductivity tensor k_D , and a tensor dielectric function ϵ_D could be

altered, for example, via inelastic scattering of the photons of wave vector k_0 in applied fields (*E*,*H*). Losses such as nonradiative decay due to photo-absorption and/or thermoelastic effect due to the piezoelectric drive (PZT) furnish Eq. II.1 with source terms q_i . For a radiative heat flux Φ_r and a domain translational motion velocity vector v, the thermal state T is the solution of Eq. II.1. Light scattering resulting in an electric displacement field **D** together with current *J* leaves the system in an electromagnetic state described by the solution of Eq. III.1. The quantum state (e.g., charge states) ψ of a nanoscale specimen such as shallow and bulk defects in crystalline materials (e.g., nitrogen-vacancy centers in diamond) or free electrons confined in a matrix (e.g., quantum dots in a semiconductor) could be obtained from Eq. IV.1 if the potential V and the effective mass *m* are known. The probe could also be prepared in a mechanical quantum state (e.g., squeezed deformation state of a silicon microcantilever or a shallow ion entangled with a mechanical eigenmode of the cantilever). The displacement *w* and momentum π densities of the cantilever, as sums over eigenstates of frequencies ω_n , are given by Eqs. IV.2 and IV.3, respectively. A challenge in quantitative imaging is the lack of unified and accurate tip-sample contact mechanics (38). The main common models displayed in Eqs. V.1 to V.4 are used to quantify material properties, though reproducibility issues remain. The properties enter these models via effective tip-sample stiffness E_6 Hamaker constant H (via $\alpha = HR/6$), and Poisson ratio v. For a tip of a given shape (e.g., conical, pyramidal, and parabolic), a radius of curvature R (~10 nm) and half-angle opening θ are used together with an indentation depth δ occurring at a sample point of height *h*, in response to a force *F* to yield a stiffness K.

PROBE MECHANICAL EXCITATION

The most straightforward atomic FM (AFM) modality that could provide a subsurface channel involves mechanical excitation of just the probe at specific frequencies (see "Mechanical state" in Fig. 1). The cantilever response (photodetector output signal) is detected at the same frequencies. Amplitude modulation AFM (AM-AFM), also called tapping mode, is the most widely used AFM technique in which a cantilever is oscillated at or near its natural resonance frequency while the oscillation amplitude is kept constant by adjusting the tip-sample height via a feedback controller (39). The topographic information is acquired from the feedback loop, while the phase shift between the cantilever excitation and the response detection provides information about the mechanical properties of the specimen (Fig. 2A). The tip indentations and amplitude/ phase versus distance curves, captured during the approach to and retract from the specimen, may be used to reconstruct 3D images, for example, of the block copolymer and semicrystalline samples, as shown by Spitzner et al. (9) (Fig. 2B). By determining the indentation into the specimen and using the effective spring constant, and the dissipation and damping quantities that describe the tip-sample interaction, a depth-resolved image may be obtained (9). Because of the necessity of collecting amplitude/phase data at different points of the sample for different indentation depths, the data acquisition and analysis are time-consuming and complex in this method (see table S1).

Subsurface characterization may also be obtained from bimodal/ trimodal AFM (40, 41), in which the cantilever is simultaneously vibrated by two or three driving forces at first and second (and Table 1. Subsurface techniques and their spectral characteristics. AFM, atomic force microscopy; AFAM, atomic force acoustic microscopy; AM-AFM, amplitude modulation AFM; CR-AFM, contact resonance AFM; EFM, electrostatic FM; FMM, force modulation microscopy; HFM, heterodyne FM; HPFM, hybrid photonic-nanomechanical FM; ICR-AFM, intermittent contact resonance AFM; KPFM, kelvin probe force microscopy; LUFM, lateral ultrasonic FM; MFM, magnetic force microscopy; MSAFM, mode-synthesizing AFM; RDF-AFM, resonant difference-frequency AFM; SNFUH, scanning near-field ultrasonic holography; UAFM, ultrasonic AFM.

Technique	Sample drive frequency	Probe drive frequency	Detection frequency	Features
AM-AFM	-	f ₁	f ₁	Amplitude and phase versus indentation curves, the resonance frequency of the cantilever
AM-AFM dc-biased	—	<i>f</i> ₁	<i>f</i> ₁	The resonance frequency of the cantilever, phase lag, and tip dc bias
EFM (two steps)	-	<i>f</i> ₁	f ₁	The resonance frequency of the cantilever, electrostatic force, tip dc bias, and lift mode
EFM (one step)	-	f_1 and f_{elec}	f_1 and f_{elec}	The resonance frequency of the cantilever, electrostatic force, tip dc, and ac bias
KPFM	-	f_1 and f_{elec}	f_1 and f_{elec}	The resonance frequency of the cantilever, constant tip ac voltage, tip dc voltage for control purposes, and surface potential is the measured quantity
MFM	-	f ₁	f ₁	Resonance frequency of cantilever, magnetic force, phase, and/or frequency of cantilever in lift mode are used to construct magnetic images
Bimodal (trimodal) AFM	-	$f_1(f_{c1}), f_2(f_{c2}),$	$f_1(f_{c1}), f_2(f_{c2}), \dots$	Resonance frequencies of the cantilever, simultaneous excitation and detection of different eigenmodes of cantilever, amplitude, and phase images
FMM	$f_1(f_c)$	-	$f_1(f_c)$	Low frequency, contact resonance, and linear repulsive regime of interaction
AFAM (CR-AFM)	$f_1(f_c)$	-	$f_1(f_c)$	High frequency, contact resonance, contact stiffness measurement, and acoustic frequency
UAFM	$f_1(\approx f_c)^*$	$f_1(\approx f_c)^*$	$f_1(\approx f_c)$	Contact resonance, linear and/or nonlinear interaction regime, and ultrasonic frequency
Second- harmonic UAFM	$f_1(\approx 1/2f_c)$	-	$2f_1(\approx f_c)$	Nonlinear force, contact resonance, and ultrasonic frequency
CR-AFM	$f_1(f_c)$	-	$f_1(f_c)$	Contact resonance, the sample is excited to excite and detect the <i>n</i> th contact eigenmode frequency of cantilever, simultaneous topography, and contact stiffness imaging
UFM	$f_1(\gg f_c), f_m \ll f_1$	-	f _m	Nonlinear force, high frequency, nonlinear interaction regime through modulation frequency (f_m), and ultrasonic response
LUFM	$f_1(\gg f_c),$	$f_{2(torsional)}(\ll f_{tc})$	$f_1(\gg f_c), f_{tc}$	Nonlinear force, high vertical frequency, and torsional vibration
ICR-AFM	f _{pft}	$f_1(f_c)$	f ₁ (f _c), f _{PTF}	Contact resonance, intermittent contact, measurement of contact stiffness at different indentation depths, the 3D elastic response of the material, characterization of adhesive property, and dynamics of the dissipated energy
HFM (on- resonance) (RDF-AFM)	$f_1 (\gg f_c)$	$f_2 \left(\approx f_1 + f_c\right)$	$ f_2 - f_1 \; (\approx f_c)$	Nonlinear force, contact resonance, high frequency, amplitude, and phase at the beat frequency
HFM (off- resonance)	$f_1 (\gg f_c)$	$f_2 (\approx f_1 + f_c)$	$ f_2 - f_1 \ (\neq f_c)$	Nonlinear force, high frequency, amplitude, and phase at the beat frequency
SNFUH	$f_1 (\gg f_c)$	$f_2 (\gg f_c)$	$ f_2 - f_1 $	Soft-contact mode (for hard specimen) and near-contact mode (for soft samples), holography and near-field mode for detection, and noninvasive acoustic waves for depth sensitivity
MSAFM	$f_i \ (i = 1:n)$	$f_j (j = 1:m)$	$ f_i - f_j $	Coupled mode at various frequencies corresponding to a synthesized mode
			<i>i</i> = 1: <i>n</i> , <i>j</i> = 1: <i>m</i>	
HPFM	f _i (i = 1:n), hv	f _j (j = 1:m)	$ f_i - f_j $ i = 1:n, j = 1:m	Hybrid (nanomechanical + photonic) approach using a synthesized mode in conjunction with infrared (<i>hv</i>) photoacoustic spectroscopy (chemical mapping)

*In UAFM, the cantilever (46) or sample (62) can be excited.

Fig. 2. SPM-based probe mechanical excitation for subsurface imaging. (A) Principle of tapping-mode (amplitude modulation) AFM. (B) (i) Three-dimensional reconstructed stiffness of the top 19 nm of erythropoietic protoporphyrin with a single slice shown in (ii), and along a lamella marked with the dotted line in the phase image (acquired at 90% amplitude setpoint) (iii), where the crystalline lamellae and amorphous material are represented by bright and dark regions, respectively. (iv to vi) Representative stiffness maps at different indentation depths of 1, 5, and 15 nm, respectively [adapted with permission from Spitzner et al. (9)]. (C) Principle of bi/trimodal AFM. (D) Topography and phase-shift imaging invoking the first, second, and third eigenmode reveal buried glass NPs under spin-coated polydimethylsiloxane (PDMS) film on SiO₂ substrate, as shown for various third mode amplitude setpoints [adapted with permission from Ebeling et al. (40)]. (E) Driving the cantilever at ω_{drr} creates oscillation harmonics $n\omega_{dr}$ (n = 0,2,3, ...) due to the tip-sample force nonlinearity. (F) (i) A single breast cancer cell (MDA-MB-231), and color-coded height maps of scanning droplet cell microscopy (ii and iii) where the amplitude, phase, and local storage of Young's modulus reveal peripheral actin stress fibers and nucleoli. The topography and deflection maps could only visualize the actin fibers. (iv) A slice along the green line in (iii) shows the depth and size of the nucleoli (red) and cell shape and F-actin (green) [adapted with permission from Efremov et al. (45)]. Scale bars, 10 µm in the horizontal direction and $2~\mu m$ in the vertical direction. (G) Probe excitation in UAFM. (H) UAFM-generated surface/subsurface images of graphite. Topogra-



phy (i), amplitude (ii), and phase (iii) maps. Buried features (arrows) could only be observed in amplitude and phase images [adapted with permission from Wang et al. (46)].

third) eigenfrequencies (see the eigenvalue form of the "Mechanical state" in Fig. 1) of the cantilever (42). The amplitude or the frequency shift, depending on the first mode modulation scheme [amplitude modulation or frequency modulation], is used for topography, while the second (and third) modes are used to measure the mechanical, electrical, or magnetic properties

(Fig. 2C) (43, 44). Using trimodal AFM, Ebeling *et al.* (40) simultaneously imaged the topography and the subsurface compositional contrast and quantified the depth of buried NPs inside a soft matter (Fig. 2D). In this trimodal approach, the first eigenmode of the cantilever is used for topography, while the compositional contrast and indentation depth are acquired from the second and

third eigenmodes, respectively. The results demonstrated that increasing the setpoint amplitude of the third mode leads to the detection of more internal features from the phase shift of the first and second eigenmodes. A 30-nm lateral resolution was reported in this study. Perrino *et al.* (*41*) applied trimodal AFM with a sub-10-nm lateral resolution to image iron oxide NPs and silicon nanowire (Si-NW) circuits embedded under a 70-nm layer of polydimethylsiloxane. Both topography and phase contrast of the first mode could detect the spin-coated Si-NWs and iron oxide NPs.

Recently, Efremov *et al.* (45), using multi-harmonic AFM with a long-tip microcantilever, imaged the 3D subcellular and subnuclear structures of living cells (Fig. 2, E and F). In multi-harmonic AFM, the cantilever is directly excited by magnetic, Lorenz, piezoelectric, or photothermal forces. Observables, including the amplitudes and phases of zeroth, first, and second harmonics of the cantilever, are then acquired and linked to appropriate contact mechanics models (e.g., Hertz or Sneddon) to associate the observable parameters with the surface and subsurface properties of specimens (45).

In ultrasonic AFM (UAFM) (46, 47), the cantilever or sample oscillation, caused by external forces, is detected at the contact resonance (CR) frequency (f_c), while the interaction may be controlled to be in both linear and nonlinear regimes (Fig. 2G). To maintain the system in a linear regime, the frequency of detection equals that of actuation. However, if the UAFM detection is performed by a demodulation scheme, then the force applied on the tip is considerably higher and the system is in the nonlinear regime. UAFM has been used to detect defects in graphite within the range from 18.6 to 77.1 nm (Fig. 2H) (46).

SAMPLE MECHANICAL EXCITATION

Subsurface information may also be garnered, by mechanical excitation of the sample, typically, at frequencies in the kilohertz, acoustic, and ultrasonic ranges (Figs. 1 and 3A). The elasticity and dissipation energy at the tip-sample contact point carry subsurface information. This is used in force modulation microscopy (FMM) (48, 49), where the tip maintains contact with the specimen in the repulsive regime of the interaction while being driven through sample vibration at a few kilohertz. FMM has been used for subsurface imaging of the core of polymer-encapsulated cobalt NPs (49). However, to avoid any tip or sample damage, the materials used in FMM measurements are to have stiffness values in the order of cantilever spring constant, which is generally low (see table S1).

FMM-like techniques may be used to also detect MHz sample vibrations. As in FMM, the tip-sample distance modulation in the repulsive (linear) regime of the interaction causes a cantilever oscillation at the sample frequency. These high-frequency techniques are used in atomic force acoustic microscopy (AFAM) (50) and scanning local acceleration microscopy (51), which, compared to FMM, offer the advantage of using compliant cantilevers to attain contact stiffness of stiff materials. The remarkable reduction in friction caused by the high-frequency vibration decreases the risk of damage when imaging soft delicate samples. AFAM has visualized gold NPs buried in polystyrene (PS) films, gold lines covered by polymethyl methacrylate (PMMA) (52), defects in amorphous films (53), subcellular features (Fig. 3B) (54, 55), and defects in graphite (Fig. 3C) (46).

In ultrasonic FM (UFM), a sample is excited at ultrasonic frequencies, which are higher than the resonance frequencies of

typical cantilevers. As the cantilever cannot respond resonantly to the sample vibration, detection in the linear regime is less useful. Therefore, if the tip-sample distance is modulated within the nonlinear regime (see "Interaction force model" in Fig. 1), then an additional ultrasonic force (averaged over a period) acts upon the cantilever (47, 56-58), causing an additional displacement. Its magnitude is a function of the tip-sample interaction regime that is swept by the tip-sample distance while being modulated at ultrasonic frequencies. Hence, the cantilever deflection will depend on the sample surface and subsurface elastic and adhesive properties. Therefore, the subsurface features of different elasticity which are located within the range of the contact stiffness field can be imaged. Detection of the molybdenum disulfide (MoS₂) and thin flakes of graphite that were transferred onto structured polymeric substrates (56), characterization of early and late-stage amyloid- β peptide aggregation (47), and observation of the lattice defects under atomically flat terraces of highly oriented pyrolytic graphite (HOPG) (59) are examples of UFM uses. van Es et al. (60) used the UFM to image aluminum nanofeatures embedded under 300-nmthick photoresist, photoresist with titanium, and SiO₂ layers, respectively. Recently, Piras et al. (61) have used UFM to image aluminum features on a silicon substrate embedded beneath a 300-nm-thick photoresist and 50-nm-thick titanium layers. In second-harmonic UAFM (62), a sample oscillates at a cantilever frequency, f_1 (close to half-CR frequency, $f_c/2$). Higher-order cantilever oscillation, excited by nonlinear interaction, can be monitored with high sensitivity at $2f_1$, which is close to f_c . Using this mode of UAFM, Au particles embedded in the polymer top-coat film have been detected (62).

To measure its *n*th contact eigenfrequency, the cantilever is excited over a spectrum encompassing the *n*th and (n + 1)th of its free resonance frequencies through sample excitation (see "Mechanical state" in Fig. 1). With a known *n*th free resonance frequency, the CR frequency f_c^n may be quantitatively associated with the contact stiffness of the tip-sample interaction, allowing topographic and contact stiffness imaging (63). Using CR-AFM, silica NPs buried in PS have been imaged at depths ranging from 32 to 165 nm (63). Topography and stiffness mapping of microglia cells engulfed with Fe₃O₄ NPs (64), detection of silica NPs embedded beneath PS films (63), and detection of defects, subsurface features, and atomic structures of graphene featuring deliberately modified subsurface interfaces are examples of CR-AFM (Fig. 3D) (65). Quantifiable CR-AFM has been used to extract details of surface and subsurface features of PS-polypropylene blends, in terms of dissipation and Young's modulus (Fig. 3E) (66). Recently, CR-AFM has been used to discern the subsurface of flexible circuit samples with 52-, 117-, 185-, 380-, and 653-nm-thick top layers, respectively (67).

INTEGRATED SAMPLE AND PROBE EXCITATION

A more diversified subsurface signal transduction may be obtained via excitation of both the cantilever and the sample at frequencies encompassing the cantilever resonance spectrum (\sim kHz) up to ultrasonic ranges (Fig. 4A). Under such an excitation scheme (see "Interaction force model" in Fig. 1), for example, the cantilever torsional vibration can provide the map of subsurface features including delamination or edge dislocations (58). To achieve this, the sample can be driven laterally at frequencies below the cantilever

Downloaded from https://www.science.org on July 07, 2023

Fig. 3. SPM-based sample mechanical excitation for subsurface imaging. (A) The specimen is driven at acoustic or ultrasonic frequencies, while the probe remains engaged with the surface. (B) Columns a to e show morphology, amplitude, phase, fused, and reference maps of eukaryotes and prokaryotes cells. Row I: Onion epidermal cells; II: MCF7; III: MDA-MB-231; IV: human erythrocyte; V: Escherichia coli; and VI: Staphylococcus aureus cells [adapted with permission from Li et al. (54)]. (C) Defect detection in graphite using AFAM topography (i), amplitude (ii), and phase (iii). The demarcated features in the amplitude and phase maps are absent in the topography. The dashed lines indicate the edge position in the height map [adapted with permission from Wang et al. (46)]. (D) CR-AFM image on an oxygen-intercalated multilayer graphene sample discloses recognizable subsurface regions. (i) Topography and (ii) associated CR frequency imaging of the first flexural mode. (iii and iv) Zoom-in height and frequency maps of the regions illustrated in the red box in (i) and (ii). CR-AFM discloses three recognizable areas highlighted by "I," "II," and "III" in (iv) [adapted with permission from Tu et al. (65)]. (E) Cross-sectional tomography with CR-AFM. (a) AFM micrograph illustrating the surface height of a polystyrene-polypropylene (PS-PP)-blend polymer. (b and d) Cross-sectional tomography maps of CR frequency and (c and e) the second eigenmode amplitude across the region in (a). The vertical xz and yz cross sections of the tomography maps alongside the crosslines are illustrated in (a). The maps in (b) and (c) were extracted from captured data during probe approaches toward the specimen, and the maps in (d) and (e) were extracted from captured data during retracts from the specimen. The PP and PS areas have been determined visually in the horizontal tomography planes by their contrast in frequency and amplitude [adapted with permission from Stan et al. (66)].



ii

resonance frequency. As a result, the cantilever can be excited into a torsional mode via surface friction forces, a technique referred to as lateral force modulation. Excitation of additional vertical ultrasonic oscillation of the sample changes the torsional torque of the cantilever during the tilt of the tip (58). As the torsional torque is generated during tip indentation into the sample, it is sensitive to surface friction and subsurface shear rigidity.

i

The simultaneous mechanical stimulation of the probe and the sample furnishes a dynamic platform for subsurface microscopy

(68). In heterodyne FM (HFM), the sample and the cantilever are excited at different ultrasonic frequencies, whereas, in resonant difference-frequency atomic force ultrasonic microscopy (RDF-AFUM), the difference is tuned to the resonance frequency of the cantilever (69–71). The nonlinear tip-sample interaction leads to different frequency generation. As the specimen is driven at the frequency f_1 and the cantilever at f_2 , the cantilever oscillation is modulated at $f_1 - f_2$ (beat frequency). If the total amplitude is sufficiently high for covering a nonlinear range of interaction force, then an

iii

Fig. 4. SPM-based integrated probe/sample mechanical excitation for subsurface imaging. (A) Schematic implementation of full-frequency excitation. (B) AFM topography (a and c) and SNFUH phase maps (b and d) reveal (after 24-hour incubation) features of malaria-infected red blood cells and a notable contrast due to parasites inside. (c) and (d) illustrate early-stage parasite infection after 4 hours of incubation [adapted with permission from Shekhawat and Dravid (73)]. (C) (i) Mouse cell topography and (ii) intracellular imaging using SNFUH. (iii) Micrograph of mouse fibroblast cell (blue: nucleus, red: actin protein in cell's skeleton) [adapted with permission from Diebold (74)]. (D) Topography and detection of intracellular NPs embedded in alveolar macrophages from SiO₂-exposed mice. The exposure route and cell sample origin are shown in (i). Topographic and SNFUH phase [(ii) and (iii) (left and right, respectively)] maps from a cell collected 24 hours after exposure. (iii) A chosen area in (ii) is rescanned at a higher resolution, where ovals indicate the existence of silica. The dark blue ovals show SiO₂ that resides on or under the cell membrane, while a, b, and c illustrate NPs deep inside the cell (27).

ultrasonic force acts upon the cantilever and causes cantilever oscillation at different mixed frequencies. In HFM, this oscillation can be lock-in detected in amplitude and phase, exploiting the electronically mixed signal as a reference. A distinctive characteristic of HFM is its capability to detect the nonlinear phase shifts between tip and sample with high temporal sensitivity. Minute differences in the sample viscoelastic/adhesive response to the tip interaction result in a phase shift of the beat signal that could be probed in the phase of HFM. The information furnished by the amplitude of HFM is very similar to UFM. Whereas, in HFM, both the cantilever and sample oscillate, in UFM, the modulation frequency is selected below the CR frequency. Using HFM, the stiffness and viscoelastic properties of PMMA rubber nanocomposites were measured (72). Also, Kimura *et al.* (62) used HFM to image Au NPs buried in a photopolymer.

To image subsurface details of both soft and hard materials, a modality similar to HFM, RDF-AFM, and UFM (47, 69, 71), the scanning near-field ultrasonic holography (SNFUH) was developed (see table S1 for comparison) (73, 74). SNFUH has been used to image NPs in cells (26, 27). In SNFUH, the sample and cantilever are driven at megahertz frequencies, that is, notably higher than those of the cantilever resonances. Like x-ray standing waves which form by the interference of scattered and reference x-ray waves, a surface acoustic standing wave is formed from the interference of the two waves in SNFUH. In this picture, a lock-in amplifier monitors the perturbations in the phase and amplitude of the

surface acoustic standing waves. Hence, when the sample acoustic response is perturbed by internal features, the cantilever can monitor the resultant alteration in the phase. Imaging with SNFUH has been reported for gold NPs embedded under polyvinylpyrrolidone and malaria parasites within the red blood cells (Fig. 4B) (73), mouse cells (Fig. 4C) (74), and SiO₂ NPs confined within a macrophage (Fig. 4D) (27).

We now consider an extension of the CR-AFM, specifically, the intermittent CR AFM (ICR-AFM) (15, 27). Here, peak force tapping (PFT), i.e., force-frequency measurements throughout individual oscillations of an intermittent-contact AFM mode, may be used to map the subsurface variations of the nanomechanical properties of high aspect ratio low-k-dielectric patterns (small relative dielectric constant) across 20- and 90-nm-wide patterns (Fig. 5A) (75). In ICR-AFM, as the tip is tapping the sample, the induced variation in the resonance frequency of a cantilever eigenmode is measured progressively. As PFT is a force-controlled AFM mode, there is a possibility of synchronization of frequency measurements with the applied force during tip-sample interaction, which can lead to a more accurate value of the contact stiffness. ICR-AFM enables (i) measurements of contact stiffness at different indentation depths that yield 3D elastic response imaging, (ii) probing the details of the tip-sample interaction at contact formation and breaking that yield characterization of the sample adhesive property, and (iii) measurements of dissipated energy during tip-sample interaction, either in contact or out of contact. Using ICR-AFM, the adhesion, elasticity, and dissipation maps of PS/PMMA film contains submicrometer-size PMMA domains were captured (76).

Given the many AFM multifrequency modalities, the question of whether it would be possible to unify the described methods is prudent. The mode-synthesizing AFM (MSAFM) (77) was developed to answer this question. In MSAFM, both the cantilever and sample are allowed to be driven with arbitrary waveforms. In general, the nonlinear nanomechanical coupling of the cantilever and the sample causes remarkable frequency mixing. The excitations of probe and sample allow a broad spectrum of first- and higher-order couplings to be explored, providing a multitude of additional information channels for FM. The amplitude or phase map of the cantilever motion, detected at specific mixed frequencies, reveals the heterogeneity in the volume of the material underneath the AFM tip (77). MSAFM has imaged SiO_2 NPs in cells (78), gold NPs in Ni (79), carbon nanohorns in alveolar macrographs and red blood cells (78), structure and composition of PMMA/exposed PMMA dielectrics at different depths (Fig. 5B) (14), and (poplar) plant cell walls ultrastructures (Fig. 5C) (27, 77, 78). In MSAFM, when an excitation channel is furnished photonically rather than mechanically, hybrid photonic-nanomechanical FM (HPFM) is achieved, allowing for spectroscopic interrogation. The HPFM (80) offers two features: (i) the generation of sum and difference frequencies due to the nonlinear nature of tip-sample interaction as a function of tip-sample distance and (ii) the dynamic influence of the so-called virtual resonance. In the latter, the oscillation at any generated mixed frequency can be magnified. In HPFM, the forces needed to drive the probe, the sample, or both can be garnered either elastically through a piezoelectric transducer or photoacoustically by the accessible photon absorption bands of the sample (typically via infrared photothermal absorption). Thus, to simultaneously obtain high spatial and spectral resolutions, HPFM uses a photonically induced sample vibration that takes

part in frequency mixing. This method can be used in cancer research, nanotoxicity, and energy storage/production (Fig. 5D) (80).

MAGNETIC, ELECTROSTATIC, AND ELECTROMAGNETIC EXCITATION

In addition to the explicitly mechanical actuation of the probesample system (including the photoacoustic actuation in HPFM), other material responses such as electrostatic, magnetic, or electromagnetic, stimulated through sending voltage or microwave signals to the cantilever and/or sample, are of interest in our review of subsurface approaches (see "Electromagnetic state" in Fig. 1 and table S1). Using AM-AFM in conjunction with an applied dc voltage to a conductive cantilever-probe ensemble (Fig. 6A), one may, for example, discern buried CNTs distributed in a poly(styrene-b-ethylene butylene-b-styrene) (SEBS) polymers, as shown by Thompson et al. (81) This method can be considered a modality of electrostatic FM (EFM), typically invoked for polymer composite characterization (82). EFM is performed in two steps beginning with the standard tapping-mode imaging to acquire topography, followed by adjusting the tip height to sense the long-range tip-sample forces and capture subsurface features. EFM has enabled the imaging of single-walled CNTs (SWCNTs) in a polymer matrix (Fig. 6B) (83). To simultaneously obtain the topography of the polyimide matrix and the image of the embedded SWCNTs, Cadena et al. (84) proposed a single-step EFM, where the conductive cantilever is vibrated at the free resonance frequency of the cantilever f_0 , while an ac voltage with a frequency $f_v < f_0$ is applied to the cantilever. Using lock-in detection, the topography is mapped, while the phase of the cantilever signal is measured with reference to (f_v) . Recently, the contact EFM (85), based on the combination of contact-mode AFM and EFM, was proposed to detect the charges hidden under atomic 2D crystals. In this method, the tip maintains phase of the cantilever signal is measured with reference to (f_{ν}) . Recontact with the sample surface, while a combination of dc and ac \exists voltages is applied to the back-gated substrate and the bending of \exists the grounded cantilever is measured.

To study the dependence of the lateral resolution upon the depth of the embedded materials, Castañeda-Uribe et al. (86) used a single-step EFM and kelvin probe FM (KPFM). The KPFM measures the contact potential difference between a conducting AFM tip and a sample. By approaching the AFM tip toward the sample surface, reliant on a feedback-based nullification of long-range electrostatic forces, the KPFM extracts the fundamental electronic properties via the simultaneous application of ac and dc signals between the sample and the tip. Castañeda-Uribe et al. (86) used the second harmonic of the KPFM signal to analyze the depth sensitivity of polymer nanocomposites, demonstrating the ability to identify the local capacitance gradient over the sample and at the interfaces of nanomaterials and polymers. A comparative study of dc-biased AM-AFM, single-pass EFM, and KPFM (86, 87) concluded that the KPFM is the most robust technique with good stability against contaminations and surface charges (see table S1).

Increasing interest in magnetic drug delivery of materials and labeled cells has brought attention to the development of magnetic FM (MFM) for subsurface visualization (88). In MFM, the detection of a signal that originates from magnetic structures buried in nano/ biomaterials provides a channel for magnetic imaging, which is coregistered with the topography. In MFM, contact or tapping-mode AFM operates in conjunction with the signal containing magnetic

Fig. 5. SPM-based integrated probe/sample mechanical excitation for subsurface imaging. (A)

Topography (i) of patterns of narrow and wide fins, and the corresponding ICR-AFM constant-load tomographic sections (ii) to (iv) contact stiffness versus applied force. (v) CR frequency versus force along L. (vi) Calculated elastic modulus. Gray shows fin locations (identified from CR-AFM and AFM measurements on top of the fins) [adapted with permission from Stan et al. (75)]. (B) MSAFM phase images of PMMA calibration samples [adapted with permission from Vitry *et al.* (14)]. (**C**) MSAFM of poplar plants. Topography of the cell walls (left) and ultrastructure detected at a mixed frequency: sample driven at a single frequency and probe driven at two different frequencies (right) (77). (D) HPFM of biomass where hu denotes the infrared photoacoustic excitation of the plant material (s), ω_{-} a difference frequency of the probe, and ω_s the specimen frequency. Probe amplitude (R_{ω}) map without (i) and with (ii) *h* υ . Phase (ϕ_{ω}) map with (iii) and without (iv) hu. (v) Phase map with hu but without mechanical actuation. The regions of decreased compositional contrast are depicted with green, dashed lines. (vi) Phase map with $h \upsilon$ and a higher probe drive amplitude. ω_{-} maps in the absence of hv (i and iv) illustrate the sample morphology. Monochromatic maps (exploiting virtual resonance) provide chemical information (ii, iii, and vi). Tuning hu discloses nanoscale areas rich in cellulose (iii and v) not probed without *h*u (i and iv) or without mechanical actuation (v) (80).

information. The magnetic signal component uses both static (deflection), and dynamic (frequency and/or phase shift) behavior of the cantilever (*87*, *88*). The most common mode is the resonant MFM which provides higher sensitivity and less damage to the sample during the imaging (*87*). Like the two-step EFM, the resonant MFM is also implemented in two steps. First, tapping-mode AFM is invoked to acquire the topography, and then the cantilever is lifted to a constant height and oscillated at its free resonance frequency f_0 . Because of the magnetic coating of the cantilever tip and the magnetic structures distributed at the surface and subsurface of the sample, the cantilever experiences a force during sample scanning, which can be detected and used to provide the magnetic images of the sample. Nocera *et al.* (89) used the MFM to detect the Fe core buried in the ferritin matrix. Similarly, MFM was

Fig. 6. SPM-based electromagnetic excitation for subsurface imaging. (A) General schematic of (i) EFM, (ii) KPFM, and, (iii) scanning microwave microscopy. (B) EFM of 170-nm-thick film of single-walled CNT (SWCNT)/PMMA composite revealing two hidden SWCNTs (i), showing (points T_1 and T_2) lift height dependence on length-corrected signal (ii), and the 3D reconstructed image of the two nanotubes (iii) (blue: PMMA matrix) [adapted with permission from Jespersen and Nygard (83)]. (C) MFM, visualizing three nonspherical aggregates (A, B, and C) of noisome (i) with remarkable phase contrast between substrate and vesicles. Topography and phase images show vesicle B resulted from the coalescence of two vesicles B1 and B2 containing many magnetic NPs [adapted with permission from Dong *et al.* (92)]. (D) Topography (i) of a 50-nm-thick SiN membrane, below which PS particles in glycerol are revealed (ii) by capacitive-mode scanning microwave impedance microscopy (sMIM) [probing depth identified in (iii)] at a scale bar of 4 µm [adapted with permission from Tselev *et al.* (99)]. For clarity, the plot in (iv) displays the signal along the white dashed line in (ii). (E) (i) Sketch of a 3D Si structure encompassing three phosphorous bars with increased dosing (coded by the same colors for both layers) at two different heights. SMM capacitance map (ii) shows the δ -layer structure with $\Delta\omega C$ and ΔG line profiles [adapted with permission from Gramse *et al.* (93)]. (F) SMM capacitance image of bipolar-doped silicon sample [adapted with permission from Brinciotti *et al.* (101)]. (G) SMM topography (i) and capacitance gradient (ii and iii) images of the p-n junction (iv) [adapted with permission from Huber *et al.* (103)].

used to detect Fe core embedded in magneto ferritin matrix (87), ferritin buried in spleen tissue (90), and iron oxide NPs buried in A375M and MCF7 cells, respectively (91). Moreover, Dong *et al.* (92) verified the encapsulation of magnetic NPs inside the noisome (Fig. 6C).

Scanning microwave microscopy (SMM)-an SPM technique of potential for subsurface studies-allows high lateral and depth resolution measurements of the electrical and magnetic properties of nanostructures buried in the nanomaterials (88, 93-101). In SMM, microwaves are emitted by a cantilever tip through a sample having a complex impedance, and the reflected and transmitted signals are detected. The involved impedance receives contributions from the surface at the contact point of the tip and from the subsurface of the sample. SMM modes include contact, lift, constant height, and intermittent contact (94). In contact mode, the tip is continuously in contact with the specimen, while, in intermittent contact mode, the tip is tapped as in tapping-mode AFM (97). In the constant height mode, the capacitance is measured at a constant distance from the substrate, while, in the lift mode, the height is controlled to keep a constant probe-sample distance. Using SMM, Biagi et al. (98) reported intrinsic capacitance images from which dielectric nanorods were detected 150-nm deep in bacterial cells. Using SMM, Tselev et al. (99) detected PS particles in glycerol packed under a 50-nmthick SiN membrane (Fig. 6D), Ag electrodes on the backside of the dielectric membrane in water, and yeast cells immersed in glycerol under an 8-nm-thick SiO₂ membrane. The capacitance was acquired following a sensitivity calibration (1.6 aF/mV) of the microscope. SMM transmission mode has allowed imaging of the dopant concentration in a thick layer of the silicon substrate (102). Plassard et al. (96) imaged aluminum structures 95 nm under a layer of Ni using SMM contact mode. Recently, Gramse et al. (93) used SMM to image the patterns and conductivity of phosphorous layers embedded in Si(100) wafers (Fig. 6E). You et al. (100) used the reflected amplitude and phase of the SMM signal to image metal lines buried 800 nm in the plasma-enhanced chemical vapor deposition-tetraethylorthosilicate (PECVD-TEOS) dielectric layer (with a maximum detectable depth of 2300 nm). The high lateral resolution of SMM provides the opportunity to image interfaces, doped regions, and junctions of semiconductors (Fig. 6F) (101). In Fig. 6F, in the areas where the concentration of doping is higher, the capacitance map displays higher values. The images of reflected topography, and calibrated capacitance of a flat p-n junction structure, are shown in Fig. 6G (103).

THERMAL-BASED METHODS

Thermal properties of specimens may be exploited for subsurface studies (see "Thermal state" in Fig. 1). In scanning thermal microscopy (SThM), a nanoprobe, behaving as a thermometer and a resistive heater, enables the mapping of thermal properties of both surface and subsurface materials including thermal conductivity and phase transition (104-107). SThM operates in both the contact and noncontact modes (106). Using the contact mode, Mills *et al.* (105) studied voids in a SiO₂ passivation layer. Cho *et al.* (108), using SThM (ultrahigh vacuum AFM with a gold-coated conductive cantilever operated in contact mode), uncovered point defects in the first layer of epitaxial graphene (Fig. 7A). The thermoelectric voltage proportional to the local thermopower of the contact area is obtained because of the localized temperature

gradient induced in the vicinity of the probe. Local variations in the density of states (DOS) in the vicinity of the Fermi level, such as additional DOS from defects, lead to local changes in thermopower. This can be detected and used as a contrast for mapping the topography. The thermoelectric voltage and the vertical displacement of the cantilever may be recorded simultaneously, allowing the topographic and thermoelectric DOS-induced features to be distinguished. Exploiting this approach, the nanoscale line patterns and spots are imaged (Fig. 7B, i and ii), while the intersecting line patterns are illustrated in the close-up images shown in Fig. 7B (iii and iv). The complex interference pattern is explored from a thermoelectric image (Fig. 7Biv), which originates from electron scattering. The inset of Fig. 7Biv, exhibiting the Fourier transform of this scattering image, proposes that electrons are scattered with the wave vector very close to the Fermi wave vector (109). This provides evidence on thermopower imaging to extract information on the DOS. SThM has further allowed mapping the local Peltier effects at the metal-semiconductor contacts to an indium arsenide nanowire (110), and the local transfer of heat to graphene on amorphous SiO₂ and crystalline silicon carbide (SiC) (Fig. 7C) (111).

Scanning near-field thermoelectric microscopy (SteM) is a member of the SThM family with remarkable applicability to quantifying the thermoelectric properties of nanomaterials (112). In SteM, a thermal probe contacts the surface of a thermoelectric specimen. By heat-modulating the probe, near-field evanescent thermal waves are induced throughout the contact region. This leads to a thermoelectric near-field interaction and consequent excitation of three harmonic signals. Then, the local Seebeck coefficient can be determined from the slope of the second harmonic voltage plotted against the ratio of the third harmonic to the first harmonic voltage (112). Therefore, the Seebeck voltage at different thermal penetration depths can be determined and used to explore the subsurface thermoelectric properties of materials.

Using SteM, Xu *et al.* (112) characterized the thermoelectric properties of the Ag_2Se and studied the dependence of the Seebeck voltage of Ag_2Se on the temperature at different modulation frequencies and the frequency dependence of the Seebeck coefficient.

Scanning thermal noise microscopy (STNM) is another class of SThM in which the thermal noise of the cantilever is exploited (*113*). By collecting the CR spectrum of a thermal noise–driven cantilever, Yao *et al.* (*114*) imaged the featureless topography of a photopolymer specimen and the noise magnitude of gold NPs buried at a depth of 300 nm.

FORCE-VOLUME METHOD

The simple yet powerful force-volume method is based on the analysis of the force-distance curves (FDCs) describing the tip-sample interaction as a function of their separation distance (see "Interaction force model" in Fig. 1). The height, surface energy, and deformation of a sample can be quantified by allowing studies of the elastic moduli and energy dissipation of specimen at different indentations. In FDC-based AFM, recording the curve at each point of a specimen enables the nanomechanical and viscoelastic properties of materials to be determined, as demonstrated in cell studies (115, 116).

Guerrero *et al.* (7) proposed a subsurface technique for imaging cellular organelles based on a classification of the FDCs at different

Fig. 7. SPM-based thermal excitation. (**A**) (i) The contact of a conductive probe with a sample surface leads to a heat flow from the tip to the sample inducing a thermoelectric voltage, the measurement of which enables thermal mapping of the sample. (ii and iii) Co-registered AFM topographic height (ii) and thermopower (iii) images of epitaxial graphene [adapted with permission from Cho *et al.* (*108*)]. (**B**) Thermoelectric identification of a local defect in bilayer epitaxial graphene: (i) topography, (ii) co-registered thermoelectric map, (iii) topography of the area indicated by a square in (i), and (iv) thermoelectric image of the area indicated by a square in (ii) [adapted with permission from Cho *et al.* (*108*)]. (**C**) Thermal resistance of graphene on SiC: (i) the topography of the graphitized SiC surface corresponding to (ii) the thermal resistance map with the SiC buffer layer (C-SiC), bilayer graphene (BLG), and single-layer graphene (SLG) (iii) probe-specimen approach curve under either ambient pressure or (iv) high-vacuum conditions [adapted with permission from Menges *et al.* (*111*)].

indentation sections (Fig. 8A). Figure 8A shows the topography and stiffness maps of a fixed (Fig. 8A, i to iv) and a live fibroblast cell (Fig. 8A, v to viii), respectively (7). Using FDCs, Roduit et al. (117) performed stiffness tomography of four different living neurons, as seen in Fig. 8B, where the red areas show the cortical actin cytoskeleton under the cell membrane. Figure 8C shows the 3D image of local and cumulative nanomechanical properties of cancerous epithelial breast cell (118). The changes of z piezo at the contact point of each set of FDCs represent the membrane roughness. As seen in Fig. 8Cii, three different nuclei can be recognized from a color map of stiffness which would not be possible using the membrane image. The FDC methods have been also applied to quantify the stiffness changes in fixed and living macrophages (119), bacterial membranes (120), and vegetal cells (121). Recently, Penedo et al. (122) proposed nanoendoscopy-AFM in which a nanoprobe repeatedly indents a cell's interior to collect FDCs. Both 3D maps of actin fiber (Fig. 8D) and 2D nanodynamics of the membrane inner scaffold were explored.

OUTLOOK

The reviewed work on subsurface studies suggests that advances made in high-resolution visualization of the internal structures of materials have been primarily in the ranges of 1 to 400 nm, laterally, and in 2 nm to 8 μ m, vertically. Whereas these metrology modalities have been relatively successful in the investigation of the forward problem, major bottlenecks remain in the case of the inverse problem. Thus, even if an unknown object can be detected by, e.g., the reviewed frequency mixing techniques, determining its properties quantitatively remains a major challenge. As described, via the mechanical, thermal, or electromagnetic approach, it is possible to detect the subsurface object and roughly quantify it, if a calibration scheme can be devised. However, devising calibration

schemes for subsurface signal transductions is an involved and challenging undertaking in and of itself. Nanofabrication methods could be invoked to design reasonably well-defined shapes, material constituency, and spatial distribution (depth placement). Nonetheless, the full set of properties of a given material requires the integration of different methods in a standard platform and/or combination with complementary microscopy techniques as well as using artificial intelligence to associate explored properties with a library of materials. To provide a framework for the quantification of materials properties at both surface and subsurface levels, the integration of nanoscale instrumentation with advances in data analysis, modeling, and computational methodologies is required. In light of the availability of higher computing power, recent achievements in data analysis and quantification for AFM methods as well as advances in Bayesian, deep learning, and signal and image processing techniques are opening advanced possibilities (123-125), which can be extended to subsurface techniques. Without high measurement speeds, it is unlikely to detect fast dynamics phenomena including charge transfer, phonon propagation, elucidation of donor-acceptor phase separation, and thermal and conductive gradient inside the materials. For biological applications, real-time visualization of subcellular dynamics and morphology of living cells with nanometer resolution remains challenging. These properties can be revealed through in situ measurement which needs notable development in the time-resolution operation of SPM techniques. Recent development in high-speed AFM measurement (126) can be explored for adaptation in subsurface imaging. Any nonlinearity and inhomogeneities in the sample surface region, in addition to those of the subsurface, can notably alter the measurements. Transient dynamics, the complexity of probe-sample interaction, and the lack of universal and inclusive tip-sample contact mechanics models (besides artifacts that could come from the atomic scale morphology of the probe) make the data acquisition

SCIENCE ADVANCES | REVIEW

Fig. 8. SPM-based force-distance approach for subsurface imaging. (**A**) Viscoelastic mapping of fixed and live NIH-3 T3 fibroblast cells: (i) topography of fixed cell, (ii) topography of actin cytoskeleton with cell depth between 0 and 500 nm, (iii) stiffness of cell with cell depth of 500 nm, (iv) viscous coefficient of the cell with cell depth of 1000 nm, (v) surface topography of live cell, (vi) topography of actin cytoskeleton with live cell depth between 0 and 100 nm, (vi) stiffness of cell at 500-nm depth, (ix) schematic of a single cell on a substrate, (x) actin-based cell cortex schematic, (xi) schematic of cell elements with substantial incorporation in cell stiffness, and (xii) cell organelles immersed in the nucleosol schematic [adapted with permission from Guerrero *et al.* (7]]. (**B**) Stiffness tomography of four different living neurons [adapted with permission from Roduit *et al.* (117)]. (**C**) (i) Volume image of the cancerous epithelial breast cell displaying surface roughness and nanomechanical properties. (ii) A vertical slice along the dashed line in (i) [adapted with permission from Stühn *et al.* (118)]. (**D**) Confocal microscopy and 3D nanoendoscopy-AFM mapping the fluorescence (i) from the stained actin filaments, amplified in (ii) for the red square region in (ii). The superimposed image in the red square in (ii) is the projection of the 3D images of (iii) and (iv) [adapted with permission from Penedo *et al.* (122)].

and analysis of SPM subsurface methods complex and time-consuming. A deeper understanding of and model for contact mechanics is also urgently needed for the characteristics of the attachment of the buried materials to the host. The role of friction and local dissipation at the buried-host interface is of explicit relevance to an understanding of the subsurface signal formation. Recent works on data acquisition reported for surface characterization and imaging can be applied and developed for subsurface application (127, 128). Other remaining challenges in subsurface methods include the complex implementation and equipment costs which yield unviable commercial calculations. Moreover, because of more complexity of the cantilever-surface and subsurface interaction in a liquid environment, implementation of SPM techniques in a liquid is considerably more challenging than in an air environment. Despite this, recent methods of FDC, SMM, SNFUH, and MSAFM show the potential to image and characterize the subcellular structure. These inliquid subsurface methods are still amenable to enhancement for in vivo measurements. The in-liquid operation would be a tremendous capability for the study of the live specimen but presents added challenges due to fluid coupling. Thickness variations can also affect the results, like the bottom (substrate) effect in indentation studies for quantitative elasticity measurements. While still in its infancy, quantum sensing is emerging as the next-generation nanometrology. Powerful measurement channels are being explored on the basis of either the quantum states of the probe-most notably mechanical state-or the readout and soon, as may be expected, both (see "Quantum state" in Fig. 1). Quantum nanomechanical squeezed states (129) and probe state readout using entangled and squeezed state photons (130) are drawing increasing attention to enhance measurement sensitivity and limit of detection via noise suppression and unique quantum correlations. Topological materials offer tantalizing opportunities in quantum subsurface studies. For example, skyrmions-spin excitations in certain magnetic materials-may be manipulated by a scanning tip over the surface where a current can be injected, and subsurface information may be collected. The subsurface problem viewed as an inverse problem encompassing many-body interactions could benefit from, for example, real-time density functional theoretic tipsurface models and machine learning algorithms computed on a quantum computer. Although these topics seem far-fetched, the reviewed nanometrology work is preparing the ground for their exploration.

Supplementary Materials

This PDF file includes: Tables S1 and S2 References

REFERENCES AND NOTES

- T. Taubner, F. Keilmann, R. Hillenbrand, Nanoscale-resolved subsurface imaging by scattering-type near-field optical microscopy. *Opt. Express* 13, 8893–8899 (2005).
- J. Z. Kovacs, K. Andresen, J. R. Pauls, C. P. Garcia, M. Schossig, K. Schulte, W. Bauhofer, Analyzing the quality of carbon nanotube dispersions in polymers using scanning electron microscopy. *Carbon* 45, 1279–1288 (2007).
- S. Lee, L. Li, Rapid super-resolution imaging of sub-surface nanostructures beyond diffraction limit by high refractive index microsphere optical nanoscopy. *Opt. Commun.* 334, 253–257 (2015).

- A. Hirohata, Y. Yamamoto, B. A. Murphy, A. J. Vick, Non-destructive imaging of buried electronic interfaces using a decelerated scanning electron beam. *Nat. Commun.* 7, 3–8 (2016).
- L. Wang, X. G. Xu, Scattering-type scanning near-field optical microscopy with reconstruction of vertical interaction. *Nat. Commun.* 6, 8973 (2015).
- A. Raman, S. Trigueros, A. Cartagena, A. P. Z. Stevenson, M. Susilo, E. Nauman, S. A. Contera, Mapping nanomechanical properties of live cells using multi-harmonic atomic force microscopy. *Nat. Nanotechnol.* 6, 809–814 (2011).
- C. R. Guerrero, P. D. Garcia, R. Garcia, Subsurface imaging of cell organelles by force microscopy. ACS Nano 13, 9629–9637 (2019).
- D. J. McClements, H. Xiao, Is nano safe in foods? Establishing the factors impacting the gastrointestinal fate and toxicity of organic and inorganic food-grade nanoparticles. *NPJ Sci. Food* 1, 6 (2017).
- E. C. Spitzner, C. Riesch, C. Magerle, Subsurface imaging of soft polymeric materials with nanoscale resolution. ACS Nano 5, 315–320 (2011).
- W. Zhang, Y. Chen, Y. Hou, W. Wang, H. Liu, L. Zheng, Subsurface imaging of rigid particles buried in a polymer matrix based on atomic force microscopy mechanical sensing. *Ultramicroscopy* **207**, 112832 (2019).
- H. Yoo, H. Park, S. Yoo, S. On, H. Seong, S. G. Im, J. J. Kim, Highly stacked 3D organic integrated circuits with via-hole-less multilevel metal interconnects. *Nat. Commun.* 10, 2424 (2019).
- K. J. Harry, D. T. Hallinan, D. Y. Parkinson, A. A. MacDowell, N. P. Balsara, Detection of subsurface structures underneath dendrites formed on cycled lithium metal electrodes. *Nat. Mater.* 13, 69–73 (2014).
- J. F. Yin, Q. Bai, B. Zhang, Methods for detection of subsurface damage: A review. Chin. J. Mech. Eng. 31, 31–41 (2018).
- P. Vitry, E. Bourillot, C. Plassard, Y. Lacroute, E. Calkins, L. Tetard, E. Lesniewska, Modesynthesizing atomic force microscopy for 3D reconstruction of embedded low-density dielectric nanostructures. *Nano Res.* 8, 2199–2205 (2015).
- M. Soliman, Y. Ding, L. Tetard, Nanoscale subsurface imaging. J. Phys. Condens. Matter 29, 173001 (2017).
- K. Moon, H. Park, J. Kim, Y. Do, S. Lee, G. Lee, H. Kang, H. Han, Subsurface nanoimaging by broadband terahertz pulse near-field microscopy. *Nano Lett.* 15, 549–552 (2015).
- 17. R. Garcia, Images from below the surface. Nat. Nanotechnol. 5, 101–102 (2010).
- A. P. Schuller, M. Wojtynek, D. Mankus, M. Tatli, R. Kronenberg-Tenga, S. G. Regmi, P. V. Dip, A. K. R. Lytton-Jean, E. J. Brignole, M. Dasso, K. Weis, O. Medalia, T. U. Schwartz, The cellular environment shapes the nuclear pore complex architecture. *Nature* 598, 667–671 (2021).
- R. Maiti, C. Patil, M. A. S. R. Saadi, T. Xie, J. G. Azadani, B. Uluutku, R. Amin, A. F. Briggs, M. Miscuglio, D. Van Thourhout, S. D. Solares, T. Low, R. Agarwal, S. R. Bank, V. J. Sorger, Strain-engineered high-responsivity MoTe₂ photodetector for silicon photonic integrated circuits. *Nat. Photonics* **14**, 578–584 (2020).
- T. Paltrinieri, L. Bondi, V. Đerek, B. Fraboni, E. D. Głowacki, T. Cramer, Understanding photocapacitive and photofaradaic processes in organic semiconductor photoelectrodes for optobioelectronics. *Adv. Funct. Mater.* **31**, 2010116 (2021).
- D. Kokkinis, M. Schaffner, A. R. Studart, Multimaterial magnetically assisted 3D printing of composite materials. *Nat. Commun.* 6, 8643 (2015).
- M. Oehzelt, N. Koch, G. Heimel, Organic semiconductor density of states controls the energy level alignment at electrode interfaces. *Nat. Commun.* 5, 4174 (2014).
- T. Schweinböck, S. Hommel, Quantitative scanning microwave microscopy: A calibration flow. *Microelectron. Reliab.* 54, 2070–2074 (2014).
- M. Ruby, B. W. Heinrich, J. I. Pascual, K. J. Franke, Experimental demonstration of a twoband superconducting state for lead using scanning tunneling spectroscopy. *Phys. Rev. Lett.* **114**, 157001 (2015).
- A. Poddubny, I. Iorsh, P. Belov, Y. Kivshar, Hyperbolic metamaterials. Nat. Photonics 7, 958–967 (2013).
- L. Tetard, A. Passian, K. T. Venmar, R. M. Lynch, B. H. Voy, G. Shekhawat, V. P. Dravid, T. Thundat, Imaging nanoparticles in cells by nanomechanical holography. *Nat. Nanotechnol.* 3, 501–505 (2008).
- L. Tetard, A. Passian, R. M. Lynch, B. H. Voy, G. Shekhawat, V. Dravid, T. Thundat, Elastic phase response of silica nanoparticles buried in soft matter. *Appl. Phys. Lett.* **93**, 133113 (2008).
- K. Bérziņš, S. J. Fraser-Miller, K. C. Gordon, Pseudo-3D subsurface imaging of pharmaceutical solid dosage forms using micro-spatially offset low-frequency Raman spectroscopy. Anal. Chem 93, 8986–8993 (2021).
- A. Besinis, T. De Peralta, C. J. Tredwin, R. D. Handy, Review of nanomaterials in dentistry: Interactions with the oral microenvironment, clinical applications, hazards, and benefits. *ACS Nano* 9, 2255–2289 (2015).

- Z. Zhao, Z. Zhou, J. Bao, Z. Wang, J. Hu, X. Chi, K. Ni, R. Wang, X. Chen, Z. Chen, J. Gao, Octapod iron oxide nanoparticles as high-performance T₂ contrast agents for magnetic resonance imaging. *Nat. Commun.* 4, 2266 (2013).
- C. Liu, X. Liu, X. Xiang, X. Pang, S. Chen, Y. Zhang, E. Ren, L. Zhang, X. Liu, P. Lv, X. Wang, W. Luo, N. Xia, X. Chen, G. Liu, A nanovaccine for antigen self-presentation and immunosuppression reversal as a personalized cancer immunotherapy strategy. *Nat. Nanotechnol.* **17**, 531–540 (2022).
- S. H. Park, J. Hwang, G. S. Park, J. H. Ha, M. Zhang, D. Kim, D. J. Yun, S. Lee, S. H. Lee, Modeling the electrical resistivity of polymer composites with segregated structures. *Nat. Commun.* **10**, 2537 (2019).
- I. A. Kinloch, J. Suhr, J. Lou, R. J. Young, P. M. Ajayan, Composites with carbon nanotubes and graphene: An outlook. *Science* 362, 547–553 (2018).
- M. Hegde, L. Yang, F. Vita, R. J. Fox, R. van de Watering, B. Norder, U. Lafont,
 O. Francescangeli, L. A. Madsen, S. J. Picken, E. T. Samulski, T. J. Dingemans, Strong graphene oxide nanocomposites from aqueous hybrid liquid crystals. *Nat. Commun.* 11, 830 (2020).
- W. Hao, M. Wang, F. Zhou, H. Luo, X. Xie, F. Luo, R. Cha, A review on nanocellulose as a lightweight filler of polyolefin composites. *Carbohydr. Polym.* 243, 116466 (2020).
- N. Bitinis, M. Hernandez, R. Verdejo, J. M. Kenny, M. A. Lopez-Manchado, Recent advances in clay/polymer nanocomposites. *Adv. Mater.* 23, 5229–5236 (2011).
- R. Mangal, S. Srivastava, L. A. Archer, Phase stability and dynamics of entangled polymernanoparticle composites. *Nat. Commun.* 6, 7198 (2015).
- R. Garcia, Nanomechanical mapping of soft materials with the atomic force microscope: Methods, theory and applications. *Chem. Soc. Rev.* 49, 5850–5884 (2020).
- R. García, R. Pérez, Dynamic atomic force microscopy methods. Surf. Sci. Rep. 47, 197–301 (2002).
- D. Ebeling, B. Eslami, S. D. J. Solares, Visualizing the subsurface of soft matter: Simultaneous topographical imaging, depth modulation, and compositional mapping with triple frequency atomic force microscopy. ACS Nano 7, 10387–10396 (2013).
- A. P. Perrino, Y. K. Ryu, C. A. Amo, M. P. Morales, R. Garcia, Subsurface imaging of silicon nanowire circuits and iron oxide nanoparticles with sub-10 nm spatial resolution. *Nanotechnology* 27, 275703 (2016).
- R. Garcia, E. T. Herruzo, The emergence of multifrequency force microscopy. Nat. Nanotechnol. 7, 217–226 (2012).
- C. A. Amo, A. P. Perrino, A. F. Payam, R. Garcia, Mapping elastic properties of heterogeneous materials in liquid with angstrom-scale resolution. ACS Nano 11, 8650–8659 (2017).
- V. G. Gisbert, C. A. Amo, M. Jaafar, A. Asenjo, R. Garcia, Quantitative mapping of magnetic properties at the nanoscale with bimodal AFM. *Nanoscale* 13, 2026–2033 (2021).
- Y. M. Efremov, D. M. Suter, P. S. Timashev, A. Raman, 3D nanomechanical mapping of subcellular and sub-nuclear structures of living cells by multi-harmonic AFM with long-tip microcantilevers. *Sci. Rep.* **12**, 529 (2022).
- T. Wang, C. Ma, W. Hu, Y. Chen, J. Chu, Visualizing subsurface defects in graphite by acoustic atomic force microscopy. *Microsc. Res. Tech.* **80**, 66–74 (2016).
- C. Tinker-Mill, J. Mayes, D. Allsop, O. V. Kolosov, Ultrasonic force microscopy for nanomechanical characterization of early and late-stage amyloid-β peptide aggregation. *Sci. Rep.* 4, 4004 (2014).
- F. Bin Li, G. E. Thompson, R. C. Newman, Force modulation atomic force microscopy: Background, development and application to electrodeposited cerium oxide films. *Appl. Surf. Sci.* **126**, 21–33 (1998).
- S. M. Deese, L. E. Englade-Franklin, L. J. Hill, J. Pyun, J. Y. Chan, J. C. Garno, Subsurface imaging of the cores of polymer-encapsulated cobalt nanoparticles using force modulation microscopy. J. Phys. Chem. C 121, 23498–23504 (2017).
- U. Rabe, W. Arnold, Acoustic microscopy by atomic force microscopy. *Appl. Phys. Lett.* 64, 1493–1495 (1994).
- N. A. Burnham, Scanning local-acceleration microscopy. J. Vac. Sci. Technol. B 14, 794–799 (1996).
- S. Hu, C. Su, W. Arnold, Imaging of subsurface structures using atomic force acoustic microscopy at GHz frequencies. J. Appl. Phys. 109, 084324 (2011).
- J. T. Zeng, K. Y. Zhao, H. R. Zeng, H. Z. Song, L. Y. Zheng, G. R. Li, Q. R. Yin, Subsurface defect of amorphous carbon film imaged by near field acoustic microscopy. *Appl. Phys. A* **91**, 261–265 (2008).
- X. Li, A. Lu, W. Deng, L. Su, J. Wang, M. Ding, Noninvasive subcellular imaging using atomic force acoustic microscopy (AFAM). *Cell* 8, 314 (2019).
- X. Yan, W. Xu, Q. Cheng, Z. Xu, Depth sensitivity of subsurface imaging using atomic force acoustic microscopy: FEA study. J. Phys. Commun. 2, 115021 (2018).
- F. Dinelli, P. Pingue, N. D. Kay, O. V. Kolosov, Subsurface imaging of two-dimensional materials at the nanoscale. *Nanotechnology* 28, 085706 (2017).

- B. J. Robinson, O. V. Kolosov, Probing nanoscale graphene-liquid interfacial interactions via ultrasonic force spectroscopy. *Nanoscale* 6, 10806–10816 (2014).
- K. Yamanaka, H. Ogiso, O. Kolosov, Ultrasonic force microscopy for nanometer resolution subsurface imaging. *Appl. Phys. Lett.* 64, 178–180 (1994).
- K. Yamanaka, UFM observation of lattice defects in highly oriented pyrolytic graphite. Thin Solid Films 273, 116–121 (1996).
- M. H. van Es, A. Mohtashami, R. M. T. Thijssen, D. Piras, P. L. M. J. van Neer, H. Sadeghian, Mapping buried nanostructures using subsurface ultrasonic resonance force microscopy. *Ultramicroscopy* 184, 209–216 (2018).
- D. Piras, P. L. M. J. van Neer, R. M. T. Thijssen, H. Sadeghian, On the resolution of subsurface atomic force microscopy and its implications for subsurface feature sizing. *Rev. Sci. Instrum.* **91**, 083702 (2020).
- K. Kimura, K. Kobayashi, K. Matsushige, H. Yamada, Imaging of Au nanoparticles deeply buried in polymer matrix by various atomic force microscopy techniques. *Ultramicroscopy* 133, 41–49 (2013).
- J. P. Killgore, J. Y. Kelly, C. M. Stafford, M. J. Fasolka, D. C. Hurley, Quantitative subsurface contact resonance force microscopy of model polymer nanocomposites. *Nanotechnology* 22, 175706 (2011).
- M. Reggente, D. Passeri, L. Angeloni, F. A. Scaramuzzo, M. Barteri, F. De Angelis, I. Persiconi, M. E. De Stefano, M. Rossi, Detection of stiff nanoparticles within cellular structures by contact resonance atomic force microscopy subsurface nanomechanical imaging. *Nanoscale* 9, 5671–5676 (2017).
- Q. Tu, B. Lange, Z. Parlak, J. M. J. Lopes, V. Blum, S. Zauscher, Quantitative subsurface atomic structure fingerprint for 2D materials and heterostructures by first-principlescalibrated contact-resonance atomic force microscopy. ACS Nano 10, 6491–6500 (2016).
- G. Stan, S. D. Solares, B. Pittenger, N. Erina, C. Su, Nanoscale mechanics by tomographic contact resonance atomic force microscopy. *Nanoscale* 6, 962–969 (2014).
- W. Wang, C. Ma, Y. Chen, L. Zheng, H. Liu, J. Chu, Subsurface imaging of flexible circuits via contact resonance atomic force microscopy. *Beilstein J. Nanotechnol.* **10**, 1636–1647 (2019).
- H. J. Sharahi, M. Janmaleki, L. Tetard, S. Kim, H. Sadeghian, G. J. Verbiest, Acoustic subsurface-atomic force microscopy: Three-dimensional imaging at the nanoscale. J. Appl. Phys. 129, 030901 (2021).
- G. J. Verbiest, T. H. Oosterkamp, M. J. Rost, Cantilever dynamics in heterodyne force microscopy. Ultramicroscopy 135, 113–120 (2013).
- G. J. Verbiest, T. H. Oosterkamp, M. J. Rost, Subsurface-AFM: Sensitivity to the heterodyne signal. *Nanotechnology* 24, 365701 (2013).
- G. J. Verbiest, M. J. Rost, Beating beats mixing in heterodyne detection schemes. Nat. Commun. 6, 6444 (2015).
- M. T. Cuberes, H. E. Assender, G. A. D. Briggs, O. V. Kolosov, Heterodyne force microscopy of PMMA/rubber nanocomposites: Nanomapping of viscoelastic response at ultrasonic frequencies. J. Phys. D Appl. Phys. 33, 2347–2355 (2000).
- G. S. Shekhawat, V. P. Dravid, Nanoscale imaging of buried structures via scanning nearfield ultrasound holography. *Science* **310**, 89–92 (2005).
- A. C. Diebold, Subsurface imaging with scanning ultrasound holography. Science 310, 61–62 (2005).
- G. Stan, E. Mays, H. J. Yoo, S. W. King, Nanoscale tomographic reconstruction of the subsurface mechanical properties of low-k high-aspect ratio patterns. *Nanotechnology* 27, 485706 (2016).
- G. Stan, R. S. Gates, Intermittent contact resonance atomic force microscopy. Nanotechnology 25, 245702 (2014).
- L. Tetard, A. Passian, T. Thundat, New modes for subsurface atomic force microscopy through nanomechanical coupling. *Nat. Nanotechnol.* 5, 105–109 (2010).
- L. Tetard, A. Passian, R. H. Farahi, T. Thundat, Atomic force microscopy of silica nanoparticles and carbon nanohorns in macrophages and red blood cells. *Ultramicroscopy* 110, 586–591 (2010).
- P. Vitry, E. Bourillot, C. Plassard, Y. Lacroute, L. Tetard, E. Lesniewska, Advances in quantitative nanoscale subsurface imaging by mode-synthesizing atomic force microscopy. *Appl. Phys. Lett.* **105**, 053110 (2014).
- L. Tetard, A. Passian, R. H. Farahi, T. Thundat, B. H. Davison, Opto-nanomechanical spectroscopic material characterization. *Nat. Nanotechnol.* **10**, 870–877 (2015).
- H. T. Thompson, F. Barroso-Bujans, J. G. Herrero, R. Reifenberger, A. Raman, Subsurface imaging of carbon nanotube networks in polymers with DC-biased multifrequency dynamic atomic force microscopy. *Nanotechnology* 24, 135701 (2013).
- M. Zhao, X. Gu, S. E. Lowther, C. Park, Y. C. Jean, T. Nguyen, Subsurface characterization of carbon nanotubes in polymer composites via quantitative electric force microscopy. *Nanotechnology* 21, 225702 (2010).
- T. S. Jespersen, J. Nygard, Mapping of individual carbon nanotubes in polymer/nanotube composites using electrostatic force microscopy. *Appl. Phys. Lett.* **90**, 183108 (2007).

- M. J. Cadena, R. Misiego, K. C. Smith, A. Avila, B. Pipes, R. Reifenberger, A. Raman, Subsurface imaging of carbon nanotube-polymer composites using dynamic AFM methods. *Nanotechnology* 24, 135706 (2013).
- J. W. Li, J. P. Cleveland, R. Proksch, Bimodal magnetic force microscopy: Separation of short and long range forces. *Appl. Phys. Lett.* **94**, 163118 (2009).
- O. A. Castañeda-Uribe, R. Reifenberger, A. Raman, A. Avila, Depth-sensitive subsurface imaging of polymer nanocomposites using second harmonic Kelvin probe force microscopy. ACS Nano 9, 2938–2947 (2015).
- D. Passeri, C. Dong, M. Reggente, L. Angeloni, M. Barteri, F. A. Scaramuzzo, F. de Angelis, F. Marinelli, F. Antonelli, F. Rinaldi, C. Marianecci, M. Carafa, A. Sorbo, D. Sordi, I. W. C. E. Arends, M. Rossi, Magnetic force microscopy: Quantitative issues in biomaterials. *Biomatter* 4, e29507 (2014).
- L. Angeloni, M. Reggente, D. Passeri, M. Natali, M. Rossi, Identification of nanoparticles and nanosystems in biological matrices with scanning probe microscopy. *Wiley Interdiscip. Rev. Nanomed. Nanobiotechnol.* **10**, e1521 (2018).
- T. M. Nocera, Y. Zeng, G. Agarwal, Distinguishing ferritin from apoferritin using magnetic force microscopy. *Nanotechnology* 25, 461001 (2014).
- A. R. Blissett, B. Ollander, B. Penn, D. M. McTigue, G. Agarwal, Magnetic mapping of iron in rodent spleen. *Nanomed. Nanotechnol. Biol. Med.* 13, 977–986 (2017).
- Z. Wang, A. Cuschieri, Tumour cell labelling by magnetic nanoparticles with determination of intracellular iron content and spatial distribution of the intracellular iron. *Int. J. Mol. Sci.* **14**, 9111–9125 (2013).
- C. Dong, S. Corsetti, D. Passeri, M. Rossi, M. Carafa, F. Pantanella, F. Rinaldi, C. Ingallina, A. Sorbo, C. Marianecci, Visualization and quantification of magnetic nanoparticles into vesicular systems by combined atomic and magnetic force microscopy, in *AIP Conference Proceedings*, 23 June 2015 (AIP Publishing LLC, 2015), vol. 1667, p. 020011.
- G. Gramse, A. Kölker, T. Lim, T. J. Z. Stock, H. Solanki, S. R. Schofield, E. Brinciotti, G. Aeppli, F. Kienberger, N. J. Curson, Nondestructive imaging of atomically thin nanostructures buried in silicon. *Sci. Adv.* **3**, e1602586 (2017).
- G. Gramse, E. Brinciotti, A. Lucibello, S. B. Patil, M. Kasper, C. Rankl, R. Giridharagopal, P. Hinterdorfer, R. Marcelli, F. Kienberger, Quantitative sub-surface and non-contact imaging using scanning microwave microscopy. *Nanotechnology* 26, 135701 (2015).
- G. Gramse, M. Kasper, L. Fumagalli, G. Gomila, P. Hinterdorfer, F. Kienberger, Calibrated complex impedance and permittivity measurements with scanning microwave microscopy. *Nanotechnology* 25, 145703 (2014).
- C. Plassard, E. Bourillot, J. Rossignol, Y. Lacroute, E. Lepleux, L. Pacheco, E. Lesniewska, Detection of defects buried in metallic samples by scanning microwave microscopy. *Phys. Rev. B.* 83, 121409–121405 (2011).
- K. Lai, W. Kundhikanjana, H. Peng, Y. Cui, M. A. Kelly, Z. X. Shen, Tapping mode microwave impedance microscopy. *Rev. Sci. Instrum.* 80, 043707 (2009).
- M. C. Biagi, R. Fabregas, G. Gramse, M. Van Der Hofstadt, A. Juárez, F. Kienberger, L. Fumagalli, G. Gomila, Nanoscale electric permittivity of single bacterial cells at gigahertz frequencies by scanning microwave microscopy. ACS Nano 10, 280–288 (2016).
- A. Tselev, J. Velmurugan, A. V. levlev, S. V. Kalinin, A. Kolmakov, Seeing through walls at the nanoscale: Microwave microscopy of enclosed objects and processes in liquids. ACS Nano 10, 3562–3570 (2016).
- L. You, J. J. Ahn, Y. S. Obeng, J. J. Kopanski, Subsurface imaging of metal lines embedded in a dielectric with a scanning microwave microscope. J. Phys. D Appl. Phys. 49, 45502 (2015).
- E. Brinciotti, G. Gramse, S. Hommel, T. Schweinboeck, A. Altes, M. A. Fenner, J. Smoliner, M. Kasper, G. Badino, S. S. Tuca, F. Kienberger, Probing resistivity and doping concentration of semiconductors at the nanoscale using scanning microwave microscopy. *Nanoscale* 7, 14715–14722 (2015).
- A. O. Oladipo, A. Lucibello, M. Kasper, S. Lavdas, G. M. Sardi, E. Proietti, F. Kienberger, R. Marcelli, N. C. Panoiu, Analysis of a transmission mode scanning microwave microscope for subsurface imaging at the nanoscale. *Appl. Phys. Lett.* **105**, 133112 (2014).
- H. P. Huber, I. Humer, M. Hochleitner, M. Fenner, M. Moertelmaier, C. Rankl, A. Imtiaz, T. M. Wallis, H. Tanbakuchi, P. Hinterdorfer, P. Kabos, J. Smoliner, J. J. Kopanski, F. Kienberger, Calibrated nanoscale dopant profiling using a scanning microwave microscope. J. Appl. Phys. 111, 014301 (2012).
- L. Bozec, M. Odlyha, Thermal denaturation studies of collagen by microthermal analysis and atomic force microscopy. *Biophys. J.* 101, 228–236 (2011).
- G. Mills, J. M. R. Weaver, G. Harris, W. Chen, J. Carrejo, L. Johnson, B. Rogers, Detection of subsurface voids using scanning thermal microscopy. *Ultramicroscopy* 80, 7–11 (1999).
- Y. Zhang, W. Zhu, F. Hui, M. Lanza, T. Borca-Tasciuc, M. Muñoz Rojo, A review on principles and applications of scanning thermal microscopy (SThM). *Adv. Funct. Mater.* **30**, 1900892 (2020).

- Y. Zhang, E. E. Castillo, R. J. Mehta, G. Ramanath, T. Borca-Tasciuc, A noncontact thermal microprobe for local thermal conductivity measurement. *Rev. Sci. Instrum.* 82, 024902 (2011).
- S. Cho, S. D. Kang, W. Kim, E. S. Lee, S. J. Woo, K. J. Kong, I. Kim, H. Do Kim, T. Zhang, J. A. Stroscio, Y. H. Kim, H. K. Lyeo, Thermoelectric imaging of structural disorder in epitaxial graphene. *Nat. Mater.* **12**, 913–918 (2013).
- E. Loftus, M. C. Anderson, C. Green, J. F. Kihlstrom, B. E. Depue, M. T. Banich, T. Curran, B. A. Van Der Kolk, J. A. Burbridge, J. Suzuki, C. Purdon, E. T. Rolls, W. L. Thompson, M. S. Gazzaniga, R. E. Passingham, A. M. Owen, G. Calcaterra, P. Bourgouin, C. M. Kelley, B. D. Mcelree, S. Chaiken, Y. Trope, T. J. Ross, E. A. Stein, T. W. Robbins, R. A. Poldrack, M. D. Lieberman, K. D. Williams, K. Meyer, V. Treyer, E. Fehr, D. Singel, Scattering and interference in epitaxial graphene. *Science* **317**, 219–223 (2007).
- F. Menges, P. Mensch, H. Schmid, H. Riel, A. Stemmer, B. Gotsmann, Temperature mapping of operating nanoscale devices by scanning probe thermometry. *Nat. Commun.* 7, 1–6 (2016).
- F. Menges, H. Riel, A. Stemmer, C. Dimitrakopoulos, B. Gotsmann, Thermal transport into graphene through nanoscopic contacts. *Phys. Rev. Lett.* **111**, 205901 (2013).
- K. Q. Xu, H. R. Zeng, K. Y. Zhao, G. R. Li, X. Shi, L. D. Chen, Scanning near-field thermoelectric microscopy for subsurface nanoscale thermoelectric behavior. *Appl. Phys. A* **122**, 521 (2016).
- A. F. Payam, W. Trewby, K. Voïtchovsky, Simultaneous viscosity and density measurement of small volumes of liquids using a vibrating microcantilever. *Analyst* **142**, 1492–1498 (2017).
- A. Yao, K. Kobayashi, S. Nosaka, K. Kimura, H. Yamada, Visualization of Au nanoparticles buried in a polymer matrix by scanning thermal noise microscopy. *Sci. Rep.* 7, 42718 (2017).
- A. F. Payam, D. Martin-Jimenez, R. Garcia, Force reconstruction from tapping mode force microscopy experiments. *Nanotechnology* 26, 185706 (2015).
- N. Bhalla, Y. Pan, Z. Yang, A. F. Payam, Opportunities and challenges for biosensors and nanoscale analytical tools for pandemics: COVID-19. ACS Nano 14, 7783–7807 (2020).
- C. Roduit, S. Sekatski, G. Dietler, S. Catsicas, F. Lafont, S. Kasas, Stiffness tomography by atomic force microscopy. *Biophys. J.* 97, 674–677 (2009).
- L. Stühn, A. Fritschen, J. Choy, M. Dehnert, C. Dietz, Nanomechanical sub-surface mapping of living biological cells by force microscopy. *Nanoscale* **11**, 13089–13097 (2019).
- C. Roduit, G. Longo, I. Benmessaoud, A. Volterra, B. Saha, G. Dietler, S. Kasas, Stiffness tomography exploration of living and fixed macrophages. *J. Mol. Recognit.* 25, 241–246 (2012).
- G. Longo, L. M. Rio, C. Roduit, A. Trampuz, A. Bizzini, G. Dietler, S. Kasas, Force volume and stiffness tomography investigation on the dynamics of stiff material under bacterial membranes. J. Mol. Recognit. 25, 278–284 (2012).
- K. Radotić, C. Roduit, J. Simonović, P. Hornitschek, C. Fankhauser, D. Mutavdžić,
 G. Steinbach, G. Dietler, S. Kasas, Atomic force microscopy stiffness tomography on living arabidopsis thaliana cells reveals the mechanical properties of surface and deep cell-wall layers during growth. *Biophys. J.* **103**, 386–394 (2012).
- M. Penedo, K. Miyazawa, N. Okano, H. Furusho, T. Ichikawa, M. S. Alam, K. Miyata, C. Nakamura, T. Fukuma, Visualizing intracellular nanostructures of living cells by nanoendoscopy-AFM. *Sci. Adv.* 7, eabj4990 (2021).
- A. Krull, P. Hirsch, C. Rother, A. Schiffrin, C. Krull, Artificial-intelligence-driven scanning probe microscopy. *Commun. Phys.* 3, 54 (2020).
- M. Rashidi, R. A. Wolkow, Autonomous scanning probe microscopy in situ tip conditioning through machine learning. ACS Nano 12, 5185–5189 (2018).
- 125. R. Garcia, Intracellular forces from stiffness. Nat. Mater. 18, 1037–1038 (2019).
- T. Ando, High-speed atomic force microscopy and its future prospects. *Biophys. Rev.* 10, 285–292 (2018).
- A. Belianinov, S. V. Kalinin, S. Jesse, Complete information acquisition in dynamic force microscopy. *Nat. Commun.* 6, 6550 (2015).
- A. F. Payam, P. Biglarbeigi, A. Morelli, P. Lemoine, J. McLaughlin, D. Finlay, Data acquisition and imaging using wavelet transform: A new path for high speed transient force microscopy. *Nanoscale Adv.* 3, 383–398 (2021).
- 129. G. Vasilakis, H. Shen, K. Jensen, M. Balabas, D. Salart, B. Chen, E. S. Polzik, Generation of a squeezed state of an oscillator by stroboscopic back-action-evading measurement. *Nat. Phys.* **11**, 389–392 (2015).
- A. Passian, G. Siopsis, Quantum state atomic force microscopy. *Phys. Rev. A* 95, 043812 (2017).
- L. Tetard, A. Passian, R. H. Farahi, B. H. Davison, S. Jung, A. J. Ragauskas, A. L. Lereu, T. Thundat, Nanometrology of delignified Populus using mode synthesizing atomic force microscopy. *Nanotechnology* 22, 465702 (2011).

- G. Shekhawat, A. Srivastava, S. Avasthy, V. Dravid, Ultrasound holography for noninvasive imaging of buried defects and interfaces for advanced interconnect architectures. *Appl. Phys. Lett.* **95**, 2007–2010 (2009).
- Y. Zhang, M. Yang, M. Ozkan, C. S. Ozkan, Magnetic force microscopy of iron oxide nanoparticles and their cellular uptake. *Biotechnol. Prog.* 25, 923–928 (2009).
- H.-b. Shen, D.-h. Long, L.-z. Zhu, X.-y. Li, Y.-m. Dong, N.-q. Jia, H.-q. Zhou, X. Xin, Y. Sun, Magnetic force microscopy analysis of apoptosis of HL-60 cells induced by complex of antisense oligonucleotides and magnetic nanoparticles. *Biophys. Chem.* **122**, 1–4 (2006).
- Y. J. Oh, H. P. Huber, M. Hochleitner, M. Duman, B. Bozna, M. Kastner, F. Kienberger, P. Hinterdorfer, High-frequency electromagnetic dynamics properties of THP1 cells using scanning microwave microscopy. *Ultramicroscopy* **111**, 1625–1629 (2011).
- 136. S. S. Tuca, G. Badino, G. Gramse, E. Brinciotti, M. Kasper, Y. J. Oh, R. Zhu, C. Rankl, P. Hinterdorfer, F. Kienberger, Calibrated complex impedance of CHO cells and E. coli bacteria at GHz frequencies using scanning microwave microscopy. *Nanotechnology* 27, 135702 (2016).
- H. Takano, S. S. Wong, J. A. Harnisch, M. D. Porter, Mapping the subsurface composition of organic films by electric force microscopy. *Langmuir* 16, 5231–5233 (2000).
- N. D. Kay, B. J. Robinson, V. I. Fal'Ko, K. S. Novoselov, O. V. Kolosov, Electromechanical sensing of substrate charge hidden under atomic 2D crystals. *Nano Lett.* 14, 3400–3404 (2014).
- M. M. Marzec, K. Awsiuk, A. Bernasik, J. Rysz, J. Haberko, W. Łuzny, A. Budkowski, Buried polymer/metal interfaces examined with Kelvin Probe Force Microscopy. *Thin Solid Films* 531, 271–276 (2013).
- 140. A. P. McGuigan, B. D. Huey, G. A. D. Briggs, O. V. Kolosov, Y. Tsukahara, M. Yanaka, Measurement of debonding in cracked nanocomposite films by ultrasonic force microscopy. *Appl. Phys. Lett.* **80**, 1180–1182 (2002).

- H. J. Sharahi, G. Shekhawat, V. Dravid, S. Park, P. Egberts, S. Kim, Contrast mechanisms on nanoscale subsurface imaging in ultrasonic AFM: Scattering of ultrasonic waves and contact stiffness of the tip-sample. *Nanoscale* 9, 2330–2339 (2017).
- A. Buck, B. K. Jones, H. M. Pollock, Temperature and thermal conductivity modes of scanning probe microscopy for electromigration studies. *Microelectron. Reliab.* 37, 1495–1498 (1997).

Acknowledgments

Funding: This work was sponsored in part by the Office of Biological and Environmental Research (BER) in the U.S. Department of Energy (DOE) Office of Science and in part by the Center for Bioenergy Innovation (CBI) of the Oak Ridge National Laboratory (ORNL) as well as Department for Economy (DfE), Northern Ireland through U.S.-Ireland R&D Partnership grant no. USI 186. CBI is a DOE Bioenergy Research Center supported by the BER in the DOE Office of Science. ORNL is managed by UT-Battelle, LLC, for the U.S. DOE under contract DE-AC05-000R22725. Author contributions: A.F.P. and A.P. wrote the paper. Competing interests: The authors declare that they have no competing interests. Data and materials availability: All data needed to evaluate the conclusions of the paper are present in the paper and/or the Supplementary Materials.

Submitted 24 January 2023 Accepted 24 May 2023 Published 28 June 2023 10.1126/sciadv.adg8292

ScienceAdvances

Imaging beyond the surface region: Probing hidden materials via atomic force microscopy

Amir Farokh Payam and Ali Passian

Sci. Adv., **9** (26), eadg8292. DOI: 10.1126/sciadv.adg8292

View the article online https://www.science.org/doi/10.1126/sciadv.adg8292 Permissions https://www.science.org/help/reprints-and-permissions

Downloaded from https://www.science.org on July 07, 2023

Use of this article is subject to the Terms of service

Science Advances (ISSN) is published by the American Association for the Advancement of Science. 1200 New York Avenue NW, Washington, DC 20005. The title Science Advances is a registered trademark of AAAS. Copyright © 2023 The Authors, some rights reserved; exclusive licensee American Association for the Advancement of Science. No claim

to original U.S. Government Works. Distributed under a Creative Commons Attribution License 4.0 (CC BY).