## **Graphene-functionalized Polymer Composites for**

# Self-sensing of Ultrasonic Waves: An Initiative

towards "Sensor-free" Structural Health Monitoring

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### Abstract

With recognized bottlenecks of guided ultrasonic wave (GUW)-based structural health monitoring (SHM) for composites, conventional polymers are nano-engineered and endowed with capability of self-perceiving GUWs. A built-in sensing network is formed with graphene nanoparticles, optimized and diffused in fibre-reinforced polymers, in which the quantum tunneling effect can be locally triggered when GUWs traverse the composites. The diffuse sensing network makes it possible to acquire GUWs at any site of the functionalized composites, avoiding use of conventional ultrasonic transducers that must be externally attached to or internally embedded in the composites. With an optimized nanostructure, the functionalized composites have been demonstrated self-responsive to GUWs up to 500 kHz. In experimental validation, GUWs propagating in a glass fibre/epoxy laminate are self-sensed by the laminate at the sites arbitrarily selected, to observe no discrepancy against counterpart signals obtained with piezoelectric sensors. To take a step further, barely visible impact damage (BVID) in the laminate is located accurately using the self-sensed GUW signals. This study has spotlighted a new breed of functional polymers with capability of self-health monitoring, without using external sensors. The use of associated cables and wires is also minimized. Not only does it facilitate a reduced weight/volume penalty to the original composites, but also minimizes mechanical degradation of the composites due to the intrusion of sensors, blazing a potential trail in developing "sensor-free" SHM for composites.

*Keywords*: functional composites; graphene nanoparticle; self-sensing; guided ultrasonic waves; structural health monitoring

#### **1. Introduction** 1

2 The biological nervous network – the most complex yet mysterious system known in the universe – is a supreme model to follow when scientists and engineers contrive, design, and 3 optimize sensing systems in engineering practice. A neural network is an intricate and 4 sophisticated collection of diffused nerves and neurons, activation of which defines a 5 recognizable linear pathway carrying messages to and from the brain/spinal cord to body 6 7 parts. In virtue of the nervous systems throughout the body, a biosome can, by nature, precisely perceive ambient fluctuation and sense self-body status, on which basis the 8 9 cognition and judgement can be subsequently made.

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In pursuit of farthest simulation of a biological nervous system, continued effort has long 11 12 been made for diverse applications in which the sensing plays a crucial role, and there is no exception for structural health monitoring (SHM) – an emerging, bionic technology with an 13 initiative to improve reliability and safety of engineering systems, accompanying significant 14 15 reduction in life-cycle costs. Effective SHM targets prospective life extension of an ageing structure via real-time, continuous, *in-situ* monitoring of its integrity. In SHM an elaborately 16 17 designed sensor network, in either a sparse or a dense fashion, is to be externally attached to or internally embedded in the structure under inspection, to acquire desired information. To 18 19 configure a sensor network, commercially available sensors are legion, as typified by lead 20 zirconate titanate (PZT) wafers, optical fibres, strain gauges, electromagnetic acoustic transducers, and polyvinylidene fluoride (PVDF) piezoelectric films to name a few. 21

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23 However, with inevitable intrusion to the original structure, the sensors per se, in whichever type, may degrade the structural integrity to some extent, regardless of their intended role of 24 25 detecting defect- or damage-caused structural deterioration. A multitude of sensors are often

networked to form a dense sensor network with a hope of acquiring rich information, but 26 27 integration of a dense sensor network unavoidably commits severer intrusion to the structure. This local material strength, introduces 28 possibly lowers defect/stress 29 concentration/debonding, downgrades resistance to corrosion, and imposes weight and penalty to original structures due to unwieldy cables and wires used in a sensor network (for 30 correlating individual sensors). Even worse, such a kind of degradation due to sensor 31 intrusion is progressive and intensified when structures are operated in a cruel service 32 environment. Under cyclic loads, an intruded sensor network runs an extremely high risk of 33 de-attaching from the host structure, owing to degradation of the adhesive layers between 34 35 the host structure and sensors. To minimize such a risk, a limited number of sensors are 36 placed at strategic sites to form a sparse sensor network, assisted with specific signal processing algorithms to manipulate "limited" information acquired. Inferior to a dense 37 network, a sparse sensor network is understandably incapable of offering high-precision 38 monitoring. 39

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The recent advances and technological breakthroughs in emerging nanotechnology have 41 ushered a promising avenue to develop new breeds of sensors capable of accommodating 42 43 demanding sensing requirements for high-precision SHM [1-4]. Prominently lightweight and small, nanocomposites-inspired sensors degrade structural integrity at a minute degree, 44 whereas offering additional merits including low cost and ease in fabrication. The 45 46 nanocomposite sensors have found their superb niche in measurement, detection and monitoring, and favorable examples include measurement of material strain under quasi-47 static loads [4, 5] or under low-frequency dynamic loads [6, 7], detection of gas content 48 leakage [8-10], and identification of structural damage [11-13]. In these paradigms, 49 nanocomposite sensors have demonstrated their higher sensitivity and precision than 50

conventional metal strain gauges or gas sensors. Representative, Zeng et al. [14] developed 51 52 a carbon black/polyvinylidene fluoride sensor that can perceive dynamic strain in a broadband frequency regime from static strain, through medium-frequency structural 53 vibration, to high-frequency ultrasound. Liu et al. [15] attempted a new nanocomposite 54 sensor, coatable on a structural surface, to replace conventional PZT wafers, and the sensor 55 shows fidelity, ultrafast response and high sensitivity to acoustic-ultrasonic signals. The 56 captured signals are comparable with those obtained with commercial PZT wafers. The 57 coated sensors can further be networked for implementing acousto-ultrasonic-wave-based 58 SHM. Though holding vast potential to strike a balance between the sufficiency of 59 60 information (as much as possible) and the usage of external sensors (as few as possible), 61 signal acquisition using thus produced sensor networks is still based on discrete measurement with individual sensors. Moreover, the reliance on cables and wires to network 62 individual sensors is still persistent. The use of printed circuits [16, 17] may, to some extent, 63 reduce the weight and volume of cables and wires, but the detachment of circuits from the 64 host structures under cyclic loads remains another predicament. 65

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Inspired by natural biological nervous systems, conventional composites have been tailor-67 68 functionalized, in which the reinforcements, such as carbon fibres or conductive particles dispersed in matrix, are exploited to sense loads applied to the composites, endowing the 69 composites with a sort of capability of "self-sensing". "Self-sensing" in this study 70 71 emphasizes an intrinsic capability of the functionalized polymer composites for sensing changes in material conditions (e.g. strain, stress, damage, temperature, etc.) in terms of the 72 measured changes of particular properties of the material itself such as piezoresistivity [18, 73 **19].** Exemplarily, Kupke *et al.* [19] used continuous carbon fibres in polymer as sensing 74 elements to measure changes in electrical resistance caused by external loads or fibre 75

breakage. It is noteworthy that using carbon fibres themselves as sensing elements is only 76 77 effective to evaluate severe damage and in particular the fibre breakage, whereas uncapable of detecting the onset of matrix damage, matrix cracking or delamination. Ruschau et al. [20] 78 extended the same sensing philosophy to glass fibre-reinforced composites, in which 79 conductive particles were dispersed into the matrix to form a conductive network for sensing 80 change in strain. This study accentuated that a sensitive sensing network could be formed 81 only when the particles are sufficient, implying a great percolation threshold is expected. For 82 example, the percolation threshold is 50 wt.% if Ag particles are opted for to form a sensing 83 network [21]. A great threshold (namely the use of a large quantity of conductive particles) 84 85 brings drastic weight increase to the original composites. To minimize weight penalty from 86 added conductive particles, lightweight nanoparticles such as carbon nanotubes, carbon black, and graphene, have gained prominence [11, 13, 22, 23], in which the percolation 87 thresholds for most nanoparticle-formed conductive networks are less than 10 wt.%. Thanks 88 to the recent advances in nanomaterials, the "self-sensing" capability has been extended to 89 fibre-reinforced polymer composites through dispersing conductive nanoparticles in 90 polymer matrix. The measured piezoresistivity can then be used to calibrate changes in strain 91 and stress or indicate the occurrence of material damage [24-26]. 92

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Nevertheless, none of the existing self-sensing networks in polymer composites, using either 94 continuous fibres or conductive particles, is responsive to an applied load of a frequency 95 96 beyond kilohertz, let alone ultrasound signals of which the frequencies are usually of several hundred kilohertz or even megahertz, along with an ultralow signal magnitude (in the order 97 of microstrain). This deficiency has considerably restricted the "self-sensing"-driven SHM 98 in a low-frequency regime (e.g., static electrical resistance tomography [27-29], quasi-static 99 loading-based detection [13] and low-frequency vibration-based monitoring [30]). It is 100

- envisaged that the methods operated in a low-frequency range are usually unwieldy to 101 102 identify embryonic damage of small dimensions such as the onset of delamination.
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In recognition of the bottlenecks of today's "self-sensing" composites, sensing networks are 104 105 formed using two-dimensional (2-D) graphene nanoparticles, and diffused in conventional 106 fibre-reinforced polymer composites, by extending the authors' earlier work on nano-107 engineered sensors for ultrasonics-based SHM [14, 15, 31]. In virtue of the quantum tunneling effect in the sensing network triggered by a traversing ultrasonic wave, the 108 109 functionalized composites are endowed with capability of self-perceiving guided ultrasonic 110 waves (GUWs) at any interested site of the composites, avoiding the use of bulky ultrasonic 111 sensors that are externally attached to or internally embedded in the composites. 112 Experimental validation is conducted, in which GUW propagating in a glass fibre/epoxy 113 laminate are self-sensed by the laminate at the sites arbitrarily selected. Propagating GUWs carry rich information pertaining to the health status of the composites, extraction of which 114 can facilitate quantitative evaluation of damage in the laminate. Addressing a new concept 115 of "diffuse sensing", this approach attempts an initiative of "sensor-free" SHM. 116

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#### 2. "Self-sensing" Composites: Principle and Fabrication 118

#### 2.1 Mechanism of "Self-sensing" 119

Upon evenly dispersed in a dielectric polymer, conductive nanofillers, such as 2-D graphene 120 121 nanoparticles, can create an electrical network in the polymer. The electrical properties of the composites can be described, according to the percolation theory [32], as 122

- $\sigma \propto \left(p p_{c}\right)^{t},$ 123 (1)
- 124 where  $\sigma$  signifies the electrical conductivity of the nanofiller-dispersed composites, p the

volume fraction of nanofiller,  $p_c$  the percolation threshold of the composites, and exponential 125 126 t a constant associated with the composites. The percolation threshold represents a critical 127 volume fraction of the nanofillers, beyond which a slight increase in the nanofiller content can give rise to a tremendous leap in the conductivity of the composites [32]. In a 128 129 nanoparticle-formed conductive network, the electrical resistance consists of three key components: the intrinsic resistance of nanoparticles ( $R_{nanoparticle}$ ), the constriction resistance 130 owing to direct contact of nanoparticles ( $R_{contact}$ ), and the tunneling resistance between two 131 132 neighbouring nanoparticles ( $R_{tunnel}$ ), namely [20]

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$$R = R_{nanoparticle} + R_{contact} + R_{tunnel}.$$
 (2)

134 In particular, the tunneling effect – a quantum mechanical effect – describes the phenomenon that when the insulative barrier between two neighbouring conductive nanoparticles 135 becomes thinner than a critical threshold, a tunneling current can be triggered when electrons 136 137 move through a barrier that they classically should not be able to move through [33-35]. It is the quantum tunneling effect that brings somewhat appealing and unique properties to 138 nanocomposites such as semi-conductive properties. In Eq. (2), R<sub>tunnel</sub>, is defined by [36] 139

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$$R_{tunnel} = \frac{V}{AJ} = \frac{2h^2 d}{3Ae^2 \sqrt{2m\lambda}} \exp\left(\frac{4\pi d}{h} \sqrt{2m\lambda}\right),$$
 (3)

141 where V denotes the electrical potential difference, J the tunneling current density, A the cross-sectional area of the tunnel, h the Planck's constant, d the distance between two 142 nanoparticles, e the quantum of electricity, m the mass of electron, and  $\lambda$  the potential height 143 144 of insulating layer (0.5-2.5 eV for epoxy in this study). The tunneling resistance,  $R_{tunnel}$ , 145 depends on the thickness and material properties of the insulating layer, which is much 146 higher than the other two types of resistance ( $R_{nanoparticle}$  and  $R_{contact}$ ) by a multitude of orders of magnitude. The tunneling effect is particularly prominent when two nanoparticles are in 147 a close proximity (of the order of several nanometers) but not in a direct contact. This stresses 148

that at the percolation threshold, the quantum tunneling effect dominates the electrical resistance manifested by the nanocomposites [1, 37-39]; beyond the threshold, nanoparticles become contacted or overlapped, under which the tunneling effect tends to be weak and the conductivity of the nanocomposites saturates.

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GUWs, high-frequency elastic waves guided by thin plate-like waveguides, feature high sensitivity to structural damage, omnidirectional dissemination, fast propagation, and strong penetration through waveguide thickness. In virtue of these features, GUWs have identified their superb applications in high-precision SHM. As GUWs traverse a nanocomposite waveguide, the wave-induced strain modulates the inter-distance among nanoparticles and consequently triggers the quantum tunneling effect if the nanoparticle-formed conductive network is close to its percolation threshold, which alternates the measured piezoresistivity.

It is such an electro-mechanical property of the nanocomposites that serves the underlying 162 mechanism to be harnessed in this study, on which basis the conventional composites are 163 functionalized, and endowed with a capability to respond to GUWs, as illustrated 164 165 schematically in Figure 1. It is noteworthy that the GUW-induced strain features an 166 extremely low magnitude that is of the order of several micro-strain, under which the tunneling effect is the key mechanism resulting in change in the conductivity of the 167 nanoparticle-formed sensing network as interpreted earlier. In virtue of the GUW-triggered 168 169 tunneling effect in the nanoparticle-formed percolating network, properly fabricated and optimized nanoparticle-dispersed composites can warrant desired sensitivity to propagating 170 GUWs. 171

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### 174 **2.2 Development and Optimization of Self-sensing Network**

Driven by the above-mentioned sensing philosophy, 2-D graphene nanoparticles are selected as the nanofiller to develop the "self-sensing" network, on the ground of a twofold fact, when compared against other candidate nanofillers such as carbon nanotube or carbon black,

(i) less entanglement and aggregation: the 2-D morphology of graphene nanoparticles 178 facilitates significant reduction in particle entanglement and aggregation, as can be 179 observed in the scanning electron microscope (SEM) image shown in Figure 2a; 180 181 compared with rope-like nanofiller types such as carbon nanotubes, Figure 2b, the less entanglement and aggregation can be conducive to creating an even, stable and 182 uniform percolating network in the matrix materials. Thus, though some theory studies 183 184 have stated that rope-like nanoparticles usually percolate at lower filler content than 185 disk-like nanoparticles do [40], real composite morphology is often found contrary [41]. Moreover the processes required to disentangle nanotubes are not cost-effective. 186 187 which may shorten the original nanotubes and further impede the formation of a percolating network [42]; 188

(ii) a greater surficial contacting area and a higher lateral-thickness aspect ratio: compared
with sphere-like nanofiller types such as carbon black, the 2-D nanoparticles give rise
to a lower percolation threshold [43] – that is because the conductive network formed
by sphere-like nanoparticles is based on fractal aggregates as seen in Figure 2c;
moreover the lower surficial area of sphere-like nanoparticles makes it difficult to
engender sufficient conductive paths in a sensing network. Similar results have also
been reported in many places and connected to the electrical properties [44-46].

- 197 2-D few-layer graphene nanoparticles with a thickness of  $\sim$ 3 nm and a lateral size of  $\sim$ 10-50
- 198 µm are obtained from TANFENG Graphene Tech Co., Ltd., China. Epoxy resin (Araldite®

GY 251) and hardener (Aradur<sup>®</sup> HY 956) are mixed at a mix ratio of 5:1 by weight to develop 199 200 the matrix. The epoxy resin is first placed on a hot plate and heated up to 80°C to decrease 201 its viscosity. 2-D graphene nanoparticles are uniformly dispersed in the matrix to form an 202 even conductive network using a direct mixing method. Mechanical stirring is applied to 203 mix graphene nanoparticles into the matrix for 30 minutes, followed with a sonication in a bath-type sonicator for another 5 minutes. Consequently, plain-woven glass fibre fabrics 204 205 (Colan AF 218) are impregnated with the graphene-compounded epoxy using a hand roller by a hand lay-up process, in Figure 3, to produce a series of identical 8-layer laminates with 206 207 a thickness of ~1.4 mm each. Upon curing at a room temperature for 24 hours following a 208 standard vacuum bagging procedure, the graphene-diffuse glass fibre-reinforced composite 209 laminates are readily available.

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211 In the above a direct mixing method is used to mingle graphene nanoparticles with matrix. In earlier work [47-49], solution-based methods are often employed to disperse nanoparticles 212 in a polymer, in which a large volume of solvents (acetone, chloroform, N-methyl-213 pyrrolidone, dimethylformamide, etc.), which is usually 10-1000 times the volume of that of 214 215 the polymer itself, has to be consumed, in order to break up nanoparticle agglomeration and 216 entanglement. Good for a small amount of production, these methods, however, are generally infeasible to manufacture laminated nanocomposite structures because such a process entails 217 a large amount of nanoparticle-filled epoxy resin, incurring excessive cost and being 218 219 environmentally unfriendly. To circumvent this, a direct mixing method is adopted to disperse graphene nanoparticles into polymers, warranting even and uniform dispersion 220 221 without obvious nanoparticle agglomeration (note that it is however not the case for rope- or sphere-like nanoparticles (e.g., carbon nanotubes or carbon blacks), in which a direct mixing 222 223 method may incur prominent particle entanglement and bundling).

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225 GUWs are of high frequencies yet ultralow magnitudes, and GUW-induced strains are 226 usually insufficient to trigger the quantum tunneling effect in a graphene nanoparticlesformed conductive network without appropriate structural optimization. To develop an 227 228 optimal conductive network that is most sensitive to GUWs, the above graphene-diffuse glass fibre-reinforced composites are comparatively fabricated with different percentages of 229 230 graphene, whereby to ascertain the percolation threshold at which the tunneling resistance,  $R_{tunnel}$ , dominates, as interpreted in Section 2.1. This is different from those cases when 231 relatively large strain, such as that induced by structural vibration, is to be measured, in 232 233 which the change in electrical resistance is mainly attributable to the disconnection among 234 nanoparticles and breakage of electrical paths in the conductive network (namely, the change 235 in  $R_{contact}$ ).

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At different percentages of graphene nanoparticles ranging from 0 to 5 wt. % (seen in **Table** 1), the conductivity ( $\sigma$ ) of the fabricated composites is measured using a standard two-point volt-amperometric method with a digital multimeter (Keithley<sup>®</sup> DMM 7510). Silver conductive paints (SPI<sup>®</sup> Z05001) are pre-coated on the fabricated samples to create electrodes. Here  $\sigma$  is calculated according to

243 
$$\sigma = \frac{L}{R\xi},$$
 (4)

where *R* signifies the measured resistance (as defined by Eq. (2)),  $\xi$  the cross-sectional area, and *L* the distance between two electrodes. Four identical samples at each content are tested, yielding a correlation as plotted in **Figure 4**. A marked increase, by a six-order of magnitude, in the conductivity of the composites can be observed when the content of graphene nanoparticles is between 0.5 and 1 wt%, and this indicates substantial formation of a

| 249 | percolating network within the composites. According to the percolation theory [43], the      |
|-----|---|
| 250 | percolation threshold can be determined as 0.8647 from the power-law function curve fitting   |
| 251 | based on Eq. (1). The formation of a percolating network warrants the response sensitivity    |
| 252 | of the sensing network to GUWs. The percolation region is generally linked to the highest     |
| 253 | sensitivity of nano-engineered composites [5, 50]. Specifically, for sensing GUWs, the        |
| 254 | amplitude of a captured GUW signal has been demonstrated to reach its maximum when the        |
| 255 | graphene nanoparticle content is at the percolation threshold, as reported in authors' future |
| 256 | work.   |
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### 258 **3. "Sensor-free"-inspired SHM**

259 Conventionally, GUWs-based SHM employs miniaturized sensors such as PZT wafers or 260 optical fibres that are internally embedded or surface-mounted on an inspected structure, 261 serving as GUW actuators or receivers. These sensors are collocated into a transducer 262 network via cables and wires [51, 52]. Considering practicability, actuators and sensors have 263 to be prudently positioned at strategic sites of an inspected structure.

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Distinct from this conventional means of configuring a sensor network for GUWs-based 265 SHM, the developed composites with self-sensing capability substantially eliminate such a 266 267 need to install external sensors for GUW acquisition. Notably, GUW signals can be acquired 268 any site of the composites as the nanoparticle-formed sensing network is diffuse in the composites. In addition, the removal of associated cables and wires for linking individual 269 sensors also brings additional merits, and this in particular mitigates the degradation of 270 271 adhesive layers between the host structure and a sensor network under cyclic loads, and reduces the weight and volume added to the original structures. 272

Though only a few PZT wafers are still used as GUW actuators to generate and maintain 274 275 continuous propagation of probing GUWs in the composites, there are, in principle, an 276 infinite number of sensing paths that can be created at the percolating sensing network, and GUWs can be captured whithersoever. Such a sensing philosophy is illustrated schematically 277 278 in Figure 5. Printed electrical circuits and electrodes can further be used to network PZT actuators and self-sensing networks. Not only are the composites thus fabricated endowed 279 280 with significantly enhanced sensing capability with exponentially increased sensing paths, but they also minimize the intrusion from an additional sensor system to the original 281 structures. This addresses a concept of "sensor-free" GUW acquisition, which is crucial to 282 283 maintain the integrity of original composite structures and eliminate material degeneration 284 due to an added transducer network.

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Upon acquisition of GUW signals from the sites of interest, desired signal features can be 286 extracted, either in a linear domain (e.g., time-of-flight (ToF) [53-55], wave reflection and 287 transmission coefficients [56-58], energy dissipation [59, 60] and converted wave modes [61, 288 62]) or in a nonlinear domain (e.g., first-[63], second-[64] or sub-[65] harmonics, spectral 289 290 sidebands [66], shift of resonance frequency [67]). Focusing on development and 291 demonstration of a new breed of nano-engineered composites with capability of self-sensing GUWs, this study adopts an easy-to-extract signal feature – ToF – for identifying structural 292 293 damage, as a proof-of-concept demonstration. In a nutshell, with ToF extracted from a 294 captured GUW signal, the location of damage, if any in the inspected composite structure, can be triangulated via 295

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$$t_{A-D-S} - t_{A-S} = \left(\frac{L_{A-D}}{V_1} + \frac{L_{D-S}}{V_2}\right) - \frac{L_{A-S}}{V_1} = \Delta t , \qquad (5)$$

297 where

$$L_{A-D} = \sqrt{(x_d - x_a)^2 + (y_d - y_a)^2},$$
$$L_{D-S} = \sqrt{(x_s - x_d)^2 + (y_s - y_d)^2},$$
$$L_{A-S} = \sqrt{(x_s - x_a)^2 + (y_s - y_a)^2}.$$

In the above,  $t_{A-D-S}$  denotes the ToF of the incident probing GUW propagating from the wave 299 actuator to the damage, and then to the sensing point (any site on the composite structure of 300 301 interest), and  $t_{A-S}$  the ToF of the probing GUW propagating directly from the actuator to that 302 sensing point.  $V_1$  is the group velocity of the probing GUW, and  $V_2$  the group velocity of the 303 damage-scattered waves ( $V_1$  is not necessarily to be identical to  $V_2$ , provided mode conversion occurs upon the interaction of incident probing GUW with damage). LA-D, LD-S 304 305 and  $L_{A-S}$  represent the distances between the actuator  $(x_a, y_a)$  and the damage center  $(x_d, y_d)$ , 306 the distance between the damage center and the sensing point  $(x_s, y_s)$ , and the distance 307 between the actuator and the sensing point, respectively.  $\Delta t$  (i.e., ToF) is to be determined 308 from a captured GUW signal. With known  $V_1$ ,  $V_2$ ,  $(x_a, y_a)$  and  $(x_s, y_s)$ , the solutions to Eq. (5) 309 can be ascertained, which mathematically shape an elliptical or an ellipse-like locus with the actuator and the sensing point being two foci – the dot line shown in Figure 6, indicating all 310 possible locations of the damage center. With ToF extracted from another sensing path,  $(x_d, x_d)$ 311  $y_d$ ) can be obtained. Note that for the fabricated self-sensing composites, GUW acquisition 312 313 can be implemented at any sites of the composites, and with more sensing paths the location 314 of the damage can be determined by mathematically seeking the intersection of all loci.

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To facilitate the above process, a probability-based diagnostic imaging (PDI) algorithm [52, 316 317 60, 68, 69] is introduced, able to visualize the identified damage location in a twodimensional greyscale image. PDI presents the diagnostic results in terms of the probability 318 of presence of damage in an inspected structure. Using PDI, the inspection region of the 319 320 composite structure is meshed virtually, and projected to an image with each image pixel 321 corresponding exclusively to a spatial point in the inspected region. The probability of 322 damage presence at each spatial point is then calibrated in terms of the value borne by its 323 corresponding pixel in the image, via

324 
$$S(\mathbf{x}, \mathbf{y}) = \sum_{r=1}^{n} A_r(\mathbf{x}, \mathbf{y}) D_r \left( \frac{\sqrt{(x - x_a^r)^2 + (y - y_a^r)^2} + \sqrt{(x - x_s^r)^2 + (y - y_s^r)^2}}{V} \right), \quad (6)$$

where S(x, y) denotes the field value at location (x, y) for the  $r^{th}$  sensing path in the sensing network, which is linked to the probability of damage occurrence therein.  $D_r(t)$  signifies the profile of energy amplitude of the relative difference between the baseline and current signals, captured via the  $r^{th}$  path, which reads

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$$D(t) = \frac{H(t) - H_0(t)}{H_0(t)},$$
 (7)

where H(t) and  $H_0(t)$  are the Hilbert transform-processed current signal and baseline signals, respectively.  $A_r(x, y)$  represents a weight coefficient determined by the propagation distance of the  $r^{th}$  path as

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$$A(x,y) = \left[\beta - \left(\frac{\sqrt{(x-x_a)^2 + (y-y_a)^2} + \sqrt{(x-x_s)^2 + (y-y_s)^2}}{\sqrt{(x_a-x_s)^2 + (y_a-y_s)^2}}\right)\right] / (\beta - 1), \quad (8)$$

where  $\beta$  is a scaling parameter controlling the size of the elliptical locus area that is 1.05 in this study (see [70] for selection criteria of  $\beta$ ). Again, the present study accentuates development of functionalized composites with self-sensing of GUWs, and details of the signal processing and damage identification algorithms can be referred to authors' previous work [69-72].

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#### 340 **4. Experimental Validation**

### 341 **4.1 Description of System and Samples**

342 A system for generating and acquiring GUWs is developed, illustrated schematically in

Figure 7. The system comprises three core modules: i) GUW generation module (consisting 343 mainly of an arbitrary waveform generator (NI<sup>®</sup> PXI-5412) and a linear power amplifier 344 (Ciprian<sup>®</sup> US-TXP-3)), via which tailor-made probing GUWs in narrow-band waveforms 345 can be generated in a frequency range of 0-2.5 MHz; ii) GUW acquisition module (consisting 346 mainly of a digitizer (NI<sup>®</sup> PXI-5105) and a signal conditioner (Ciprian<sup>®</sup> LNA-EO-3)), 347 whereby GUW signals can be acquired at a sampling rate up to 60 MHz; and iii) a central 348 349 control and post-processing module embedded with in-house software interface. In particular, a self-developed, dedicated signal amplifier is integrated in the system, to facilitate 350 acquisition of GUWs of high frequencies yet ultralow magnitudes. The amplifier converts 351 352 resistance signals to voltage signals upon noise filtering.

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Using the manufacture procedure described in Section 2.2, an 8-layer [0/90] laminated 354 355 composite plate made of plain-woven fabrics, measuring  $300 \times 300 \times 1.4$  mm<sup>3</sup>, is fabricated, with a diffuse graphene nanoparticle-formed percolating sensing network. The laminate, in 356 its intact status, is used to examine its capability of self-sensing GUWs. The self-sensing is 357 implemented by painting a silver electrode pair with a gap of  $\sim 1$  mm on the composite 358 surface at any desired sensing location. This gap is prudently selected and controlled during 359 fabrication, to achieve an electrical resistance that is compatible with that of the Wheatstone 360 bridge in the signal amplifier. 361

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#### **4.2 Frequency Sweep Test** 363

To examine the correctness and sensitivity of the fabricated composite laminate to self-364 perceived GUWs of different frequencies, 5-cycle Hanning-function-modulated sinusoidal 365 tonebursts are emitted into the laminate at a central frequency ranging from 50 kHz to 500 366 kHz with an increment of 10 kHz, using the system as described in Section 4.1. The 367

generated toneburst signals drive four PZT wafers (Haiying Enterprise Group Co., Ltd., P51, 12 mm in diameter and 1 mm in thickness) that are surface-mounted on the laminate, see
Figure 7. Acquisition of GUWs is implemented at multiple sensing points of the laminate
that are arbitrarily selected. For the purpose of comparison and calibration, a multitude of
PZT wafers (the same as those as the actuators) are used, each of which is collocated next to
a selected sensing point to capture GUWs in synchronism.

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### 375 4.3 Results and Discussions

Without loss of generality, Figure 8 shows representative signals i) captured via a sensing 376 path, linking a PZT actuator (75 mm from the left edge and 246 mm from the bottom edge) 377 378 to the sensing point (75 mm from the left edge and 96 mm from the bottom edge), and ii) 379 simultaneously captured using two PZT wafers that are collocated near the sensing point (5 mm from the sensing point), when the probing GUW signal is excited at 180 kHz. A 380 381 Butterworth filter is applied to screen measurement noise. In the signals acquired by two PZT wafers and self-perceived by the composite laminate itself, the first-arrival wave 382 component (viz., the zeroth-order symmetric Lamb wave mode guided by the laminate, 383 denoted by S<sub>0</sub> hereinafter) are clearly observed to dominate signal energy. Signals are in 384 385 good and quantitative agreement, in terms of the arrival time in particular. The main 386 difference between signals measured by PZT wafers and by the self-sensing network is the crosstalk at the initial moment of excitation. This crosstalk is more pronounced in the self-387 perceived signals than that in the PZT-captured signals - it can be attributed to the intrinsic 388 389 electrical conductivity of the composites with graphene nanoparticles-formed percolating sensing network. Knowing that crosstalk-related noise occurs at the onset of each signal 390 acquisition, it can be removed via proper signal processing. 391

Figure 9 shows the spectra over the time-frequency domain of the signals self-captured at 393 394 the sensing point same as the above, with the frequencies of the probing GUWs varying from 395 50 kHz to 500 kHz, which are compared against the spectra of counterpart signals captured with PZT wafers nearby. Reasonably good agreement between two spectra is noted, in which 396 397 both the  $S_0$  mode and the zeroth-order anti-symmetric Lamb wave mode (denoted by  $A_0$ , with a lower propagation velocity) are captured, showing that the amplitude of  $S_0$  mode 398 reaches its peak at an excitation of ~180 kHz. Such a phenomenon - the frequency-399 dependent signal amplitude, is referred to as wave mode tunning [73]. Note that the 400 401 difference in signal magnitude captured by PZT sensors and by graphene nanoparticle-based 402 sensing network is attributed to their completely different sensing mechanisms: a PZT wafer 403 measures the piezoelectricity which is most sensitive to surface strain, whereas the graphenebased sensing network perceives piezoresistivity that reflects the strain change through the 404 405 entire waveguide thickness.

406

407 Signals captured at other locations of the laminate all present good agreement with 408 counterpart signals obtained with nearby PZT wafers, demonstrating that the graphene 409 nanoparticles have formed a uniform, even and percolating sensing network in the 410 functionalized composite laminate, and GUW propagation in the laminate can be monitored 411 at any desired location of the structure – addressing the concept of "sensor-free" SHM.

412

### 413 5. Proof-of-Concept Application: SHM of Composite Laminate

Another composite laminate that is identical to the one examined in the above experimental validation is prepared following the same manufacture process, in which the graphene nanoparticle-formed percolating sensing network is created. The condition of the pristine laminate is first inspected using infrared (IR) thermography, showing no observable fabrication defect in the sample. During IR thermography scanning, hot air flow is used to
provide thermal stimulation to the sample, and the thermal radiation emitted from the surface
of the sample is sensed and recorded with a commercial thermographic camera (NEC<sup>®</sup>
TH9100PMV).

422

A drop-weight test is performed to introduce barely visible impact damage (BVID) in the 423 424 laminate. Subsequent IR thermography shows the BVID in the laminate, as seen in Figure 10. A PZT wafer (Haiving Enterprise Group Co., Ltd., P-51, 12 mm in diameter, and 1 mm 425 426 in thickness) is surface-mounted on the laminate, 75 mm from the left and 246 mm from the 427 bottom of the laminate, to generate probing GUW signals. GUW propagation in the laminate (upon interaction with the BVID) is self-monitored by the laminate in conjunction with the 428 system described in Section 4.1. Based on the frequency sweep test (Section 4.2), the 429 amplitude of the S<sub>0</sub> mode is observed to dominate signal energy at ~180 kHz, and is halved 430 when the excitation frequency lower than 140 kHz or greater than 260 kHz (i.e., wave mode 431 tunning). Therefore, the S<sub>0</sub> mode at 180 Hz is chosen as the probing GUW for BVID 432 characterization in pursuit of a high signal-to-noise ratio. The group velocity of the S<sub>0</sub> mode 433 434 at 180 Hz is ascertained in terms of the arrival time in Figure 8.

435

With the ToF-based PDI, as elaborated in Section 3, the BVID is characterized and visualized
in a diagnostic image, Figure 12, based on the measurement at four sensing points of the
laminate ((75, 96), (160, 16), (274, 40) and (274, 165), as shown in the Figure 11), showing
good agreement with the reality. In the present study, for the purpose of demonstration, only
several sensing points are arbitrarily selected, at each of which a pair of silver electrodes is
painted therein for transferring captured GUW signals to the signal acquisition system.
However, it is noteworthy that GUWs propagating in the functionalized laminate can be self-

sensed by the laminate at any site – that is because the sensing capability of the
functionalized composites is guaranteed by the fully dispersed nanoparticles in the polymer
matrix. Thus, the electrodes can be painted at any sites of the laminate, from which GUW
signals can be obtained.

447

#### 448 6. Concluding Remarks

This study explores the self-sensing capability of a new breed of nano-engineered functional 449 composites, in which a 2-D graphene nanoparticle-formed percolating self-sensing network 450 451 is diffused in the dielectric polymer, and the measured piezoresistivity is linked to the dynamic strain up to 500 kHz induced by propagating GUWs. The transient dynamic strain 452 453 causes disturbance to the sensing network and changes the local electrical resistance 454 accordingly. The change in resistance is then converted into voltage signals to construct wave 455 responses. The experiment results have revealed that GUW signals can be captured precisely by the percolating self-sensing network, comparable to conventional PZT sensors. With self-456 457 sensed high-frequency GUW, in situ health monitoring can be implemented for composite structures. 458

459

The developed self-sensing approach features merits over conventional sensing means 460 adopted in GUWs-based SHM such as PZT transducers. The sensing of GUWs can be 461 462 performed at any desired position of the composite structure – a trait that is substantially distinct from conventional measurement in which GUWs can only be captured by fixed 463 sensors at specific locations. The significant reduction in the use of cables and wires for 464 465 linking sensors mitigates the degradation of adhesive layers between the host structure and a sensor network under cyclic loads, and reduces the weight and volume added to the original 466 467 structure. Together, this makes a dense sensing network be formed in conventional fibre-

- reinforced polymer composites, providing a cost-effective solution for "sensor-free" SHM. 468
- Due to the fully dispersed graphene nanoparticles in the polymer matrix, the self-sensing 469
- capability of the functionalized composites is available throughout the entire laminate, 470
- addressing a concept of "sensor-free" SHM. For demonstration purposes in this study, only 471
- few sensing points are arbitrarily selected to acquire GUW signals. In future development, 472
- printed electronics-based circuits will be introduced to improve the current methodology and 473
- get a step closer to full "sensor-free" SHM. 474
- 475

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- 480

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