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2 **Model-driven Fatigue Crack Characterization and**  
3 **Growth Prediction:**  
4 **A Two-step, 3-D Fatigue Damage Modeling**  
5 **Framework for Structural Health Monitoring**

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25 **Abstract**

26 Prevailing fatigue damage evaluation approaches that make use of the acoustic nonlinearity  
27 of guided ultrasonic waves (GUWs) are sustained by simplified models, most of which  
28 depict three-dimensional (3-D) fatigue damage in a two-dimensional (2-D) domain [1]. Such  
29 approximation risks the evaluation accuracy. With such motivation, this study aspires to a  
30 new, two-step modeling framework, aimed at accurately characterizing and continuously  
31 monitoring fatigue damage, from its embryonic initiation, through progressive growth to  
32 formation of macroscopic crack. In the first step, a 3-D, analytical model based on the theory  
33 of elastodynamics sheds light on the generation of contact acoustic nonlinearity in GUWs  
34 under the modulation of ‘breathing’ behavior of a non-penetrating fatigue crack, on which  
35 basis a crack-area-dependent nonlinear damage index is yielded. In the second step, a 3-D  
36 fatigue crack growth model predicts the continuous growth of the identified fatigue crack in  
37 the length and depth along crack front. The framework is validated using numerical  
38 simulation, followed with experiment, in both of which the initiation and progressive growth  
39 of a real corner fatigue crack is monitored, with continuous prediction of the crack growth  
40 in length and depth. Results have demonstrated the accuracy and precision of the developed  
41 modeling framework for characterizing embryonic fatigue damage.

42

43 **Keywords:** fatigue crack; non-penetrating crack; structural health monitoring; contact  
44 acoustic nonlinearity; crack growth

45

46 **1. Introduction**

47 Fatigue damage in critical structural components (*e.g.*, fastener holes, bolted joints) is liable  
48 for numerous catastrophic accidents of land infrastructure, transportation vehicles, and  
49 offshore construction. Early awareness of fatigue damage, in particular the embryonic  
50 fatigue cracks, and monitoring of the progressive growth on a regular or even continuous  
51 basis are significant yet challenging. Intensive effort over the years has led to diverse  
52 evaluation techniques readily available, residing on various mechanisms and principles,  
53 which broadly embrace those using acoustic emission [2-4], guided ultrasonic waves  
54 (GUWs) [5-8], radiography [9-11], thermographic inspection [12-14], electromagnetic  
55 technique [15-17] and eddy current [18-20] to name a few. Amongst them, the GUW-based  
56 approaches outperform many others, in virtue of the superb merits that the approaches can  
57 offer, including long-range gauging capacity, high sensitivity to damage in small scale, and  
58 cost-effectiveness in implementation. The principle of GUW-based evaluation lies in the  
59 premise that the propagation attributes of a probing GUW, upon interaction with fatigue  
60 damage, are modulated and altered to some extent, and the interaction triggers specific and  
61 unique wave scattering phenomena such as wave reflection, transmission, mode conversion,  
62 wave energy shift and higher-order harmonics generation; inversely, fatigue damage can be  
63 evaluated, via appropriate models and algorithms, by scrutinizing these changes in wave  
64 attributes.

65

66 Both linear and nonlinear attributes of GUWs have been exploited extensively to  
67 accommodate the need of damage characterization. The linear features that are frequently  
68 used include the delay in time-of-flight (ToF) [21, 22], degree of energy dissipation [23, 24],  
69 mode conversion [25-27], reflection and transmission coefficients of damage-scattered  
70 wavefields [28-30]. The use of linear attributes shows particular effectiveness when the

71 characteristic dimensions of damage to be detected are comparable to the wavelength of a  
72 probing G UW – a scale at which the damage might have already evolved to a macroscopic  
73 degree and sufficed to incur fatal structural failure. However, as envisaged, majority of the  
74 fatigue life of a crack remains within a timeframe, during which the crack progresses at a  
75 microscopic scale, prior to the formation of macroscopic damage. Both numerical and  
76 experimental studies [31, 32] reveal that the duration for a fatigue crack to evolve from its  
77 initiation through growth to the formation of a visible crack takes ~80% - 90% of its entire  
78 fatigue life. Owing to this, the detectability of the evaluation approaches using linear  
79 attributes of G UWs, towards embryonic fatigue damage, is often challenged.

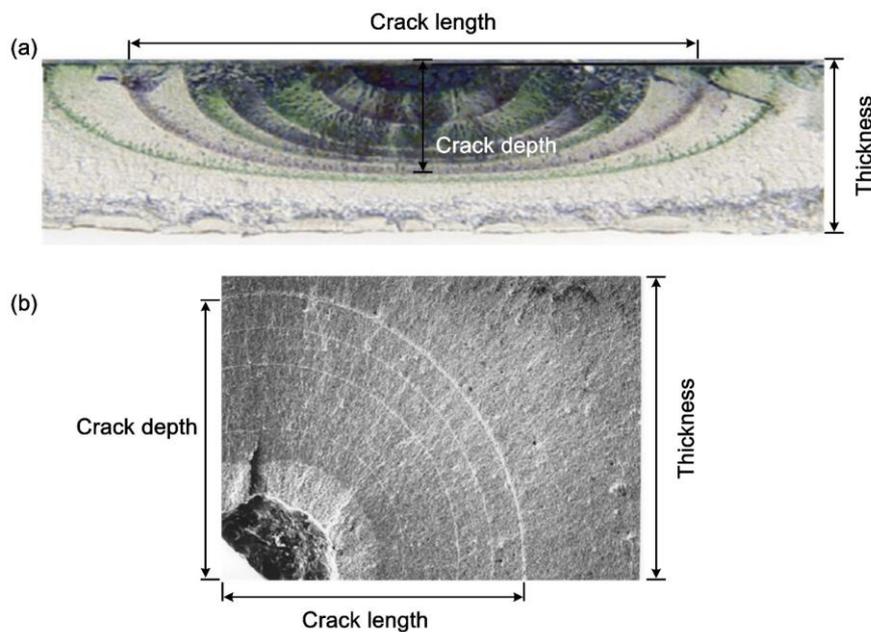
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81 In contrast to linear features, the nonlinear properties of G UWs exhibit higher sensitivity to  
82 microscopic damage, and the detectability is not restricted by the wavelength of the probing  
83 G UW [33-36]. This makes the excitation of a probing G UW at a high frequency is not of  
84 necessity. Approaches in this category are typified by those exploiting higher-order  
85 harmonics [37-39], sub-harmonics [40-42], mixed frequency responses [34, 43] and shift in  
86 resonance frequency [44]. Representatively, Ramahi *et al.* [45] developed a complementary  
87 split-ring resonator (CSRR) to assess sub-millimetre fatigue damage, based on the premise  
88 that damage, if any, perturbs the electromagnetic field around CSRR, and consequently  
89 results in the shift in resonance frequency. Sohn *et al.* [46] proposed a nonlinear ultrasonic  
90 modulation method by calibrating the sideband components captured in spectra under a  
91 mixed input of low-frequency and high-frequency G UWs, whereby to evaluate the length of  
92 a through-thickness fatigue crack. Qu *et al.* [47] explored nonlinear Rayleigh surface waves,  
93 for characterizing stress corrosion cracking (SCC) damage in carbon steel, and discovered  
94 phenomenal increase in the measured contact acoustic nonlinearity (CAN) during the early  
95 stage of SCC. Jacobs *et al.* [48] proposed a nonlinear ultrasonic technique based on the

96 second harmonic generation (SHG) of surface waves, with which microstructural change  
97 and occurrence of microcracks in heterogeneous cement-based materials can be detected.  
98 Shen and Giurgiutiu [49] studied the generation of higher-order harmonics of Lamb waves  
99 using finite element simulation and established a baseline-free damage index to assess the  
100 presence and the severity of cracks. Lee *et al.* [50] utilized the SHG approach to identify  
101 fatigue cracks in steel joint and the digital image correlation (DIC) technique was  
102 implemented to demonstrate the effectiveness of the method for identification of fatigue  
103 crack initiation and growth in joint type structures. Guan *et al.* [51] elaborated the  
104 fundamental difference in fatigue crack detection using nonlinear guided waves between  
105 plate and pipe structures and found that unlike the plate scenario using nonlinear guided  
106 waves, the second harmonic wave generated by the ‘breathing’ behavior of crack in a pipe  
107 had multiple wave modes. A proper damage index which considered all generated wave  
108 modes was proposed to quantify the acoustic nonlinearity, facilitating the identification of  
109 microscale damage and assessment of the severity of the damage in pipe structures. Earlier,  
110 the authors of this study also proposed an analytical model [1, 52], based on the modal  
111 decomposition and a variational principle, and proved its effectiveness in capturing CAN  
112 generated by a ‘breathing’ crack and depicting the fatigue crack-disturbed wavefields in both  
113 2-D and 3-D waveguides. A nonlinear damage index derived from that analytical model  
114 linked the magnitude of generated second order harmonics to that of the fundamental GUWs,  
115 which was validated by evaluating a through-thickness fatigue crack in an aluminium  
116 waveguide [1, 53]. Nevertheless, the model, by simplifying a real fatigue crack as a 2-D,  
117 through-thickness crack in the waveguide, may present inferior accuracy when the fatigue  
118 crack is in its early stage with a non-penetrating pattern.

119

120 In majority of the existing work making use of the nonlinearity of GUVs for evaluating  
121 small-scale cracks, the crack is approximated to be through the thickness of the waveguide  
122 – sort of simplification of a real fatigue crack from its three-dimensional (3-D) reality to  
123 two-dimensional (2-D) hypothesis, regardless of the fact that a fatigue crack in its embryonic  
124 stage is of a non-penetrating manner, as typified by the semi-elliptical surface cracks and  
125 quarter-elliptical corner cracks, in **Fig. 1**. As the non-penetrating stage constitutes the  
126 majority of the crack fatigue life [32, 54], such simplification makes evaluation results  
127 debatable. Addressing the significance of characterizing and monitoring 3-D, non-  
128 penetrating fatigue cracks, Masserey and Fromme [55-57] used an energy-ratio-based  
129 method in conjunction with high-frequency ultrasonic waves, to detect a quarter-elliptical  
130 corner crack emanating from a fastener hole with an area less than  $0.8 \text{ mm}^2$  (equivalent to a  
131 cracking area with  $\sim 1 \text{ mm}$  in length and in depth, respectively), and monitor its growth. A  
132 drop in the energy of the ultrasonic pulse amid the crack growth was observed.  
133



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137

**Figure 1.** Typical 3-D, non-penetrating fatigue cracks: (a) a semi-elliptical surface crack [58]; and (b) a quarter-elliptical corner crack.

138 Motivated by this, a two-step fatigue damage modeling framework is developed in this study,  
139 aimed at quantitative characterization of both the length and depth of a non-penetrating  
140 fatigue crack through its fatigue life. In the first step, a 3-D, analytical model based on the  
141 theory of elastodynamics is proposed, for analytically elucidating the generation of CAN in  
142 the probing GUW under the modulation of ‘breathing’ behavior of a non-penetrating fatigue  
143 crack. The model yields a crack-area-dependent nonlinear damage index, with which the  
144 non-penetrating crack surface area is estimated. In the second step, a 3-D fatigue crack  
145 growth model, originated from the fatigue crack growth theory, predicts the shape evolution  
146 of the identified crack along its length and depth. A proof-of-concept experiment is  
147 performed, in which a real, non-penetrating corner crack, initiated from a fastener hole is  
148 continuously monitored, with quantitative prediction of crack progress in both length and  
149 depth. Predicted results using the modeling framework are compared against those obtained  
150 from numerical simulation and experiment. The key originality of this study lies in  
151 substantial and significant extension of an analytical model, for interpreting the interaction  
152 between GUWs and ‘breathing’ crack proposed by the authors in earlier studies [1, 52] which  
153 simplify the fatigue crack in a 2-D domain. It aspires to break through the 2-D limitation of  
154 the modeling and expand the theoretical framework to a 3-D regime, whereby to accurately  
155 and quantitatively describe a real fatigue crack through its entire fatigue life.

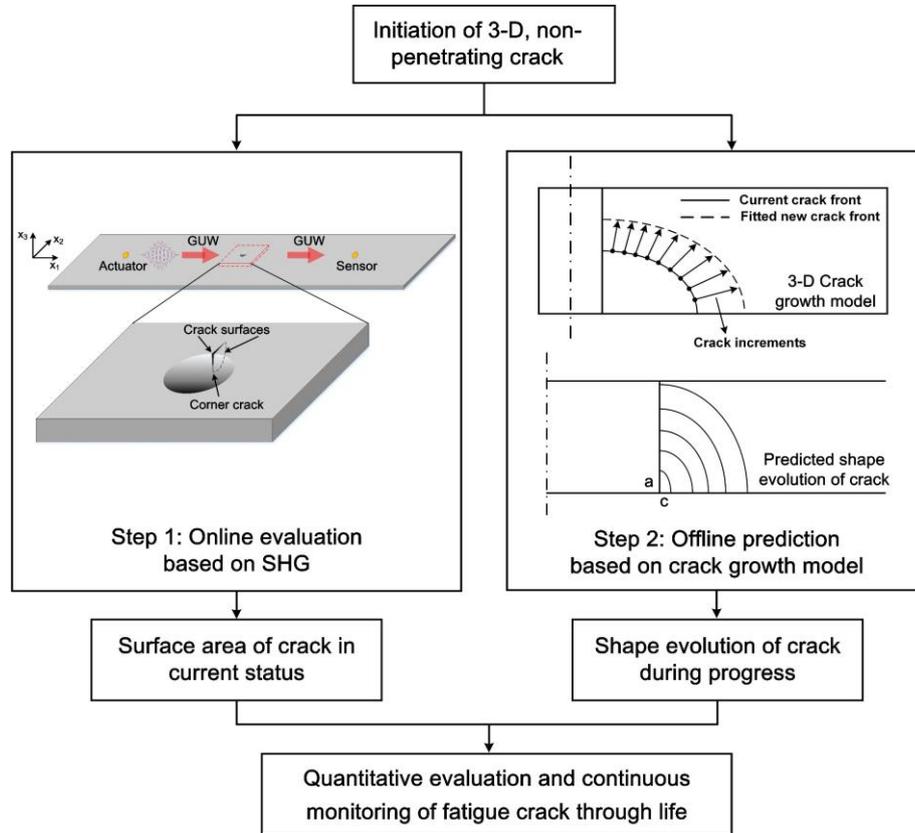
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## 157 **2. Two-step Modeling Framework**

158 The proposed modeling framework features an *online phase* and an *offline phase*. In a  
159 nutshell, a nonlinear damage index is to be developed in the online phase, by capturing and  
160 quantifying SHG, upon the interaction of a probing GUW with the non-penetrating crack,  
161 on which basis the surface area of the non-penetrating crack can be estimated; in the offline  
162 phase, further evolution of the estimated crack surface is to be predicted via a 3-D fatigue

163 crack growth model, and outputs of the offline phase are the continuous depiction of the  
 164 crack shape, and a quantitative correlation between the length and depth of the crack during  
 165 its growth. Figure 2 recaps this proposed two-step framework.

166



167

168 **Figure 2.** Flowchart of the proposed two-step modeling framework (left column showing the online  
 169 phase to estimate crack surface area using nonlinear ultrasonic testing; right column showing the offline  
 170 phase to predict the change in aspect ratio and shape evolution of the crack.

171

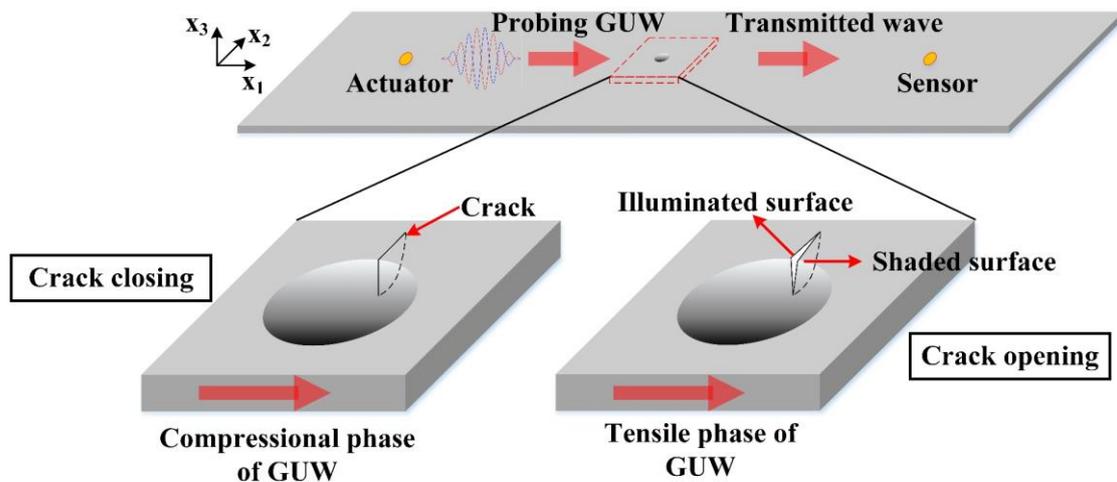
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## 173 **2.1 Online Phase: Evaluation of Non-penetrating Crack Surface**

### 174 **2.1.1 Non-penetrating Crack-induced CAN: A 3-D Perspective**

175 CAN is generated under the modulation of a fatigue crack with nonlinear ‘breathing’  
 176 behavior, when a probing G UW traverses the crack. The ‘breathing’ behavior consists of  
 177 two alternate periods: 1) during the tensile phase of the probing G UW, two surfaces of the

178 non-penetrating crack are apart from each other, partially or entirely along the waveguide  
 179 thickness, and this triggers wave scattering and mode conversion at the two surfaces; and 2)  
 180 during the compressional phase of the probing G UW, two crack surfaces are fully in contact,  
 181 and this remains G UW propagation undistorted and identical to wave propagation in an  
 182 intact counterpart waveguide (*i.e.*, an identical waveguide in which the crack does not exist).  
 183 It is the two alternate periods in a wave cycle, as schematically illustrated in **Fig. 3**, that drive  
 184 the crack to manifest a ‘breathing’ behavior. It is noteworthy that in this study, the  
 185 personified ‘breathing’ is used to describe the opening and closing of a fatigue crack that is  
 186 modulated by the probing G UW when it traverses the crack. Due to the fact that the  
 187 dimensions of the 3-D, non-penetrating fatigue cracks are minute, it is hypothesized that the  
 188 entire crack surfaces present the ‘breathing’ behavior.



190  
 191 **Figure 3.** Schematic of two alternate periods of the probing G UW upon interaction with a non-  
 192 penetrating crack with ‘breathing’ behavior: crack closing during compressional phase of G UW and  
 193 crack opening during tensile phase of G UW.

194  
 195 To depict such alternate wave propagation characteristics during the interaction with a  
 196 fatigue crack, an additional wave source is hypothesized to exist at the crack location,

197 introducing extra wavefield to the original probing G UW. This additional wave source is  
 198 referred to as ‘*crack-induced second source*’ (CISS) in the authors’ previous work [1] (for a  
 199 2-D crack scenario). CISS manifests time-dependent traits of the wavefield: it is present  
 200 when the crack opens, or absent otherwise. CISS is a consequence of the two alternate  
 201 periods of the ‘breathing’ behavior of the fatigue crack.

202

203 Consider a ‘breathing’ crack in a stress-free state (*i.e.*, no existing stress around the crack).

204 When the two crack surfaces are apart one from the other, partially or entirely, the open  
 205 surfaces are traction-free, and the CISS can be defined as a pair of equivalent concentrated

206 forces, each of which is applied on a crack surface. This hypothesis is made based on the

207 fact that the dimensions of the considered non-penetrating fatigue crack are minute. The

208 magnitude of the equivalent force on each crack surface, when crack opens, can be obtained

209 by integrating the stress on the opening area of crack surface as,

$$210 \quad |F_{eq}| = \int_{Opening\ area} -\sigma \cdot \vec{x}_1 ds, \quad (1)$$

211 where  $\sigma$  signifies the stress tensor, and  $\vec{x}_1$  the unit direction vector, see **Fig. 3**. The stress

212 at the crack surface is generated by the probing G UW. To include both the open and closed

213 statuses of the crack, CISS can be defined, for a complete wave cycle, using an indicator

214 function, as

$$215 \quad F_{eq} = |F_{eq}| \cdot e^{i\omega t} \cdot f(t), \quad (2)$$

216 where the indicator function  $f(t)$  reads

$$217 \quad f(t) = \begin{cases} 1, & t_{open} < t < t_{close} \\ 0, & t_{close} < t < t_{open} + T. \end{cases} \quad (3)$$

218 In the above,  $F_{eq}$  is the regulated form of CISS, reflecting the ‘breathing’ behavior of the  
 219 crack, and  $\omega$  the angular frequency of the probing G UW.  $t_{open}$  and  $t_{close}$  are the time when  
 220 the crack opens and closes, respectively, and  $T$  the duration of a wave cycle.

221

222 In the model, the time, at which the crack commences to open in a ‘breathing’ cycle, is  
 223 deemed as the moment when the probing G UW turns from its compressional phase to a  
 224 tensile phase; analogously, the time, at which the crack starts to close, is the moment when  
 225 the probing G UW changes from its tensile phase back to the compressional phase.

226 Considering that the fatigue crack is of 3-D pattern, the displacement of every point on the  
 227 crack surface, in general, differs from those of other points at a specific moment. Due to the  
 228 minute dimensions of the non-penetrating fatigue crack, the moment, at which the middle  
 229 point of the crack surface starts to open (or close), is adopted as the moment for the entire

230 crack to open (or close). With Eq. (2), the higher-order wave modes of the regulated form of  
 231 CISS resulted from the modulation of the ‘breathing’ crack can be determined in spectrum  
 232 via fast Fourier transform. Amongst all the higher-order modes, the second order harmonics  
 233 at the double excitation frequency ( $2\omega$ ) of the probing G UW can be extracted analytically  
 234 from the spectrum, as

$$235 \quad F_{eq}^{2\omega} = A_{2\omega} \cdot |F_{eq}| \cdot e^{i2\omega t}, \quad (4)$$

236 where  $A_{2\omega}$  denotes the magnitude of the wave mode at the double frequency of excitation.

237

238 Recalling elastodynamic analysis [59] and applying it on Eq (4), the full wavefield of the  
 239 probing G UW in the waveguide can be obtained explicitly, and thus the magnitude of the  
 240 in-plane displacement in  $x_1$  direction of the CISS-disturbed wavefield at  $2\omega$ , denoted by

241  ${}_{2\omega}u_{x_1}$ , can be obtained as

$$2\omega u_{x_1} = \sum_{m=0}^{\infty} F_{eq}^{2\omega} \cdot \frac{k_m^{2\omega}}{4i} \cdot \frac{[V_S^m(x_3)]^2}{I_{mm}^S} \cdot [H_0^2(k_m^{2\omega} r) - \frac{1}{k_m^{2\omega} r} H_1^2(k_m^{2\omega} r)]. \quad (5)$$

243 In the above,  $V_S^m(x_3)$  signifies the in-plane displacement of the  $m^{th}$ -order symmetric Lamb  
244 mode in  $x_1$  direction which varies along the waveguide thickness ( $x_3$ ),  $k_m^{2\omega}$  the wavenumber  
245 of the propagating wave at  $2\omega$  for the  $m^{th}$ -order symmetric Lamb mode, and  $r$  the distance  
246 between the crack and the location from which the wavefield is captured (*i.e.*, sensor  
247 location).  $i$  is the imaginary unit and  $I_{mm}^S$  the wave energy carried by the  $m^{th}$ -order  
248 symmetric Lamb mode.  $H_p^2(\cdot)$  represents the  $p^{th}$ -order Hankel function ( $p = 0$  or  $1$ ) of the  
249 second kind. For low-frequency G UW, only fundamental Lamb wave mode will be  
250 generated in the waveguide, and thus the magnitude of the in-plane displacement in  $x_1$   
251 direction of the CISS-disturbed wavefield at  $2\omega$  can be simplified as

$$2\omega u_{x_1}^0 = F_{eq}^{2\omega} \cdot \frac{k_0^{2\omega}}{4i} \cdot \frac{[V_S^0(x_3)]^2}{I_{00}^S} \cdot [H_0^2(k_0^{2\omega} r) - \frac{1}{k_0^{2\omega} r} H_1^2(k_0^{2\omega} r)]. \quad (6)$$

253  
254 With the obtained amplitude of the CISS-induced symmetric Lamb mode at  $2\omega$ , a nonlinear  
255 damage index,  $NI$ , is defined as

$$256 \quad NI = \frac{2\omega u_{x_1}^0}{u_{x_1}^\omega} = \left| F_{eq} \right| \cdot \frac{A_{2\omega}}{u_{x_1}^\omega} \cdot \frac{k_0^{2\omega}}{4i} \cdot \frac{[V_S^0(x_3)]^2}{I_{00}^S} \cdot [H_0^2(k_0^{2\omega} r) - \frac{1}{k_0^{2\omega} r} H_1^2(k_0^{2\omega} r)], \quad (7)$$

257 where  $2\omega u_{x_1}^0$  and  $u_{x_1}^\omega$  represent the magnitudes of the CISS-induced in-plane displacement  
258 at double ( $2\omega$ ) and fundamental ( $\omega$ ) excitation frequency, respectively. For an embryonic  
259 fatigue crack with tiny dimensions, the probing G UW-induced stress tensor can be regarded  
260 constant on each crack surface, and thus the magnitude of CISS ( $|F_{eq}|$ ) when the crack opens,  
261 obtained with Eq. (1), is proportional to the crack surface area. With the nonlinear damage  
262 index, a proportional relationship between  $NI$  and the crack surface area is established, via

263 which the severity of fatigue crack can be calibrated with an experimentally measured  $NI$ , to  
264 be demonstrated in Section 3.

265

### 266 **2.1.2 Validation Using Finite Element (FE) Simulation**

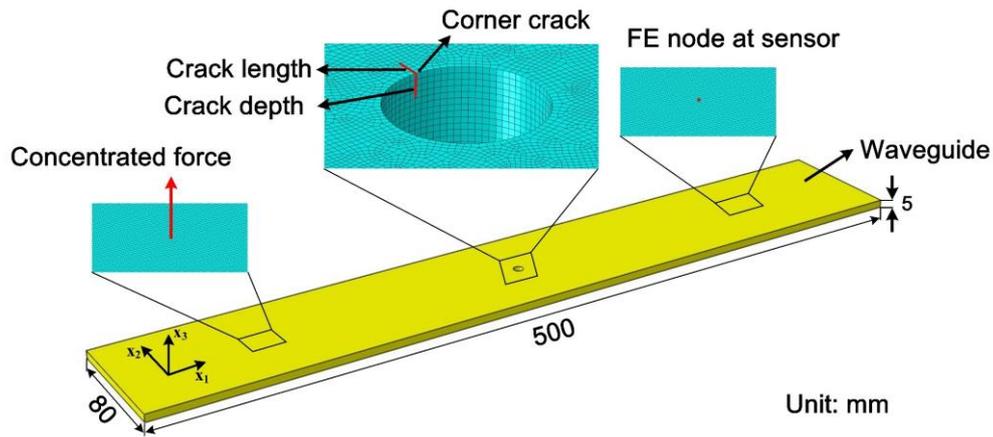
267 The relationship between the surface area of a non-penetrating fatigue crack and  $NI$ , as  
268 defined by Eq. (7), is verified using commercial software ABAQUS<sup>®</sup>/EXPLICIT  
269 (experimental validation in Section 3). A plate-like aluminium waveguide (500 mm long, 80  
270 mm wide and 5 mm thick) with a centralized fastener hole (5 mm in radius) is considered,  
271 and the developed FE model of the waveguide is shown in **Fig. 4**. A series of through-  
272 thickness cracks (2-D scenario) and a series of non-penetrating corner cracks (3-D scenario)  
273 of different degrees of severity are respectively simulated. In each simulated case, the crack  
274 exists at the fastener hole edge with its cracking surface normal to  $x_1$ . For each non-  
275 penetrating corner crack, the shape evolution is not considered, as a result of which the crack  
276 remains its original quarter-circular pattern with the same length ( $x_2$ ) and depth ( $x_3$ ), as  
277 shown in **Fig.4**. Material properties of the waveguide are listed in **Tab. 1**. Three third order  
278 elastic constants ( $A$ ,  $B$  and  $C$ ) are used in a user-defined subroutine (VUMAT) to  
279 introduce the intrinsic material nonlinearity into the model, along with the nonlinearity  
280 generated by the ‘breathing’ behavior of the crack.

281

282 **Table 1.** Material properties of the aluminum waveguide in FE simulation.

| Density<br>(kg/m <sup>3</sup> ) | Elastic<br>modulus (GPa) | Poisson’s<br>ratio | $A$<br>(GPa) | $B$<br>(GPa) | $C$<br>(GPa) |
|---------------------------------|--------------------------|--------------------|--------------|--------------|--------------|
| 2700                            | 73                       | 0.33               | -320         | -200         | -190         |

283



284

285

286

**Figure 4.** FE model of the considered waveguide bearing a non-penetrating crack.

287

288

An Hanning window-modulated 5-cycle sinusoidal toneburst is excited at a central

289

frequency of 180 kHz, by applying a pair of point-type forces on the upper and lower

290

surfaces of the waveguide, **Fig. 4**. The elements of the waveguide boundary are defined in

291

virtue of *absorbing layer by increasing damping (ALID)*, which dissipates wave energy

292

reflected from the boundary. To model the ‘breathing’ behavior of the fatigue crack, a

293

surface-surface contact pair definition is applied, with which the two crack surfaces can only

294

be either in contact or apart from each other. To strengthen the second order harmonics

295

induced by the crack, which usually have weak magnitudes compared with those of the

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fundamental wave modes, a pulse-inversion approach [60] is used. In the approach, two

297

identical probing GUWs, with the same magnitude but in opposite phase, are excited,

298

respectively, for each simulated case. The second order harmonics induced by the ‘breathing’

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crack, under two excitation conditions with opposite phase, are respectively captured,

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summation of which leads to a magnitude twice the original magnitude of the respectively

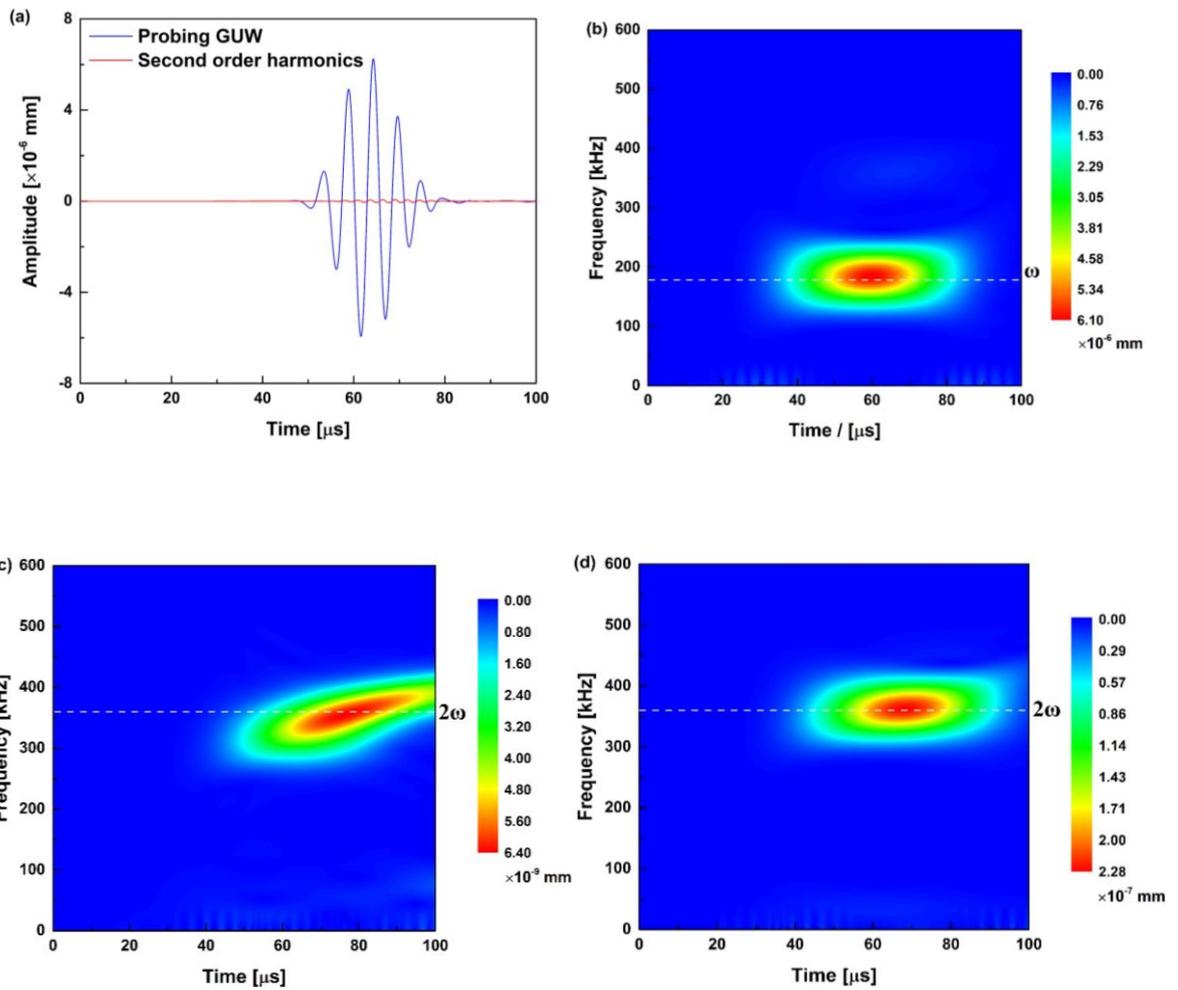
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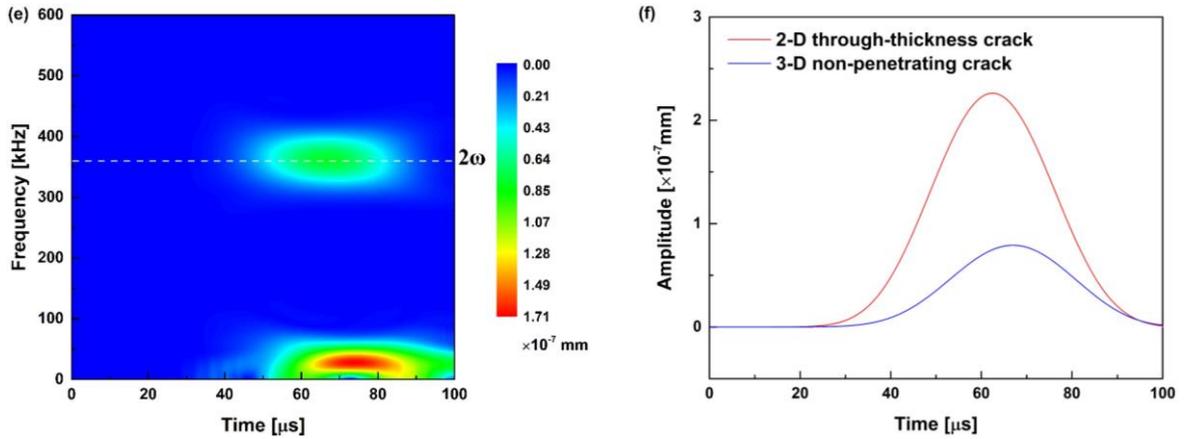
generated second order harmonics, as well as cancellation of the fundamental wave mode.

302

303 With the pulse-inversion approach, the ‘breathing’ crack-induced second order harmonics  
 304 are intensified, which is conducive to feature extraction. **Figure 5(a)** illustrates a typical  
 305 probing G UW signal and the second order harmonics generated by the modeled crack. The  
 306 short-time Fourier transform (STFT) converts the captured G UW signals from the time  
 307 domain to the time-frequency domain to ascertain the wave components at  $\omega$  and  $2\omega$ .  
 308 **Figure 5(b)** displays the spectrum of the probing G UW, and **Figs. 5(c-e)** the spectra of the  
 309 second order harmonics obtained from an intact waveguide and other two scenarios: one  
 310 containing a through-thickness crack and the other containing a non-penetrating crack, in  
 311 both of which the crack length is the same.

312





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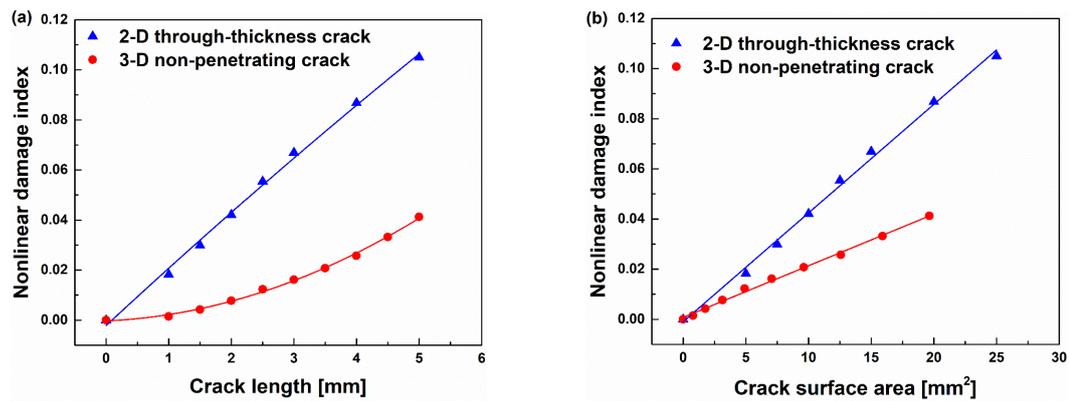
318 **Figure 5.** (a) A probing GUV signal captured from the waveguide bearing a ‘breathing’ crack and the  
 319 crack-induced second order harmonics; (b) spectrum of the probing GUV in (a); spectra (showing the  
 320 second order harmonics) for (c) an intact waveguide, (d) the waveguide containing a through-thickness  
 321 crack, and (e) the waveguide containing a non-penetrating crack; (f) comparison of the amplitudes of  
 322 the second order harmonics generated by the penetrating and non-penetrating cracks.

323

324 Compared with the intact status, the magnitude of the second order harmonics captured from  
 325 the waveguide with a crack, either through-thickness or non-penetrating, is intensified,  
 326 which is ascribed to the modulation of the ‘breathing’ behavior of the crack on the probing  
 327 GUV. It is also noteworthy that the magnitude of the second order harmonics induced by  
 328 the through-thickness crack is stronger than that induced by the non-penetrating crack, as  
 329 seen in **Figs. 5(f)** – a consequence of the larger crack surface of the through-thickness crack  
 330 compared with the non-penetrating crack when the lengths of the two cracks are the same  
 331 (the former is of a rectangular shape, while the latter is quarter-circular), which accounts for  
 332 a stronger CISS.

333

334 With ascertained magnitudes of the crack-induced second order harmonics, the nonlinear  
 335 damage index is calculated according to Eq. (7). **Figure 6** shows the calculated index against  
 336 variation in crack length and crack surface area, for both the through-thickness and non-  
 337 penetrating cracks.



339

340

341 **Figure 6.** Nonlinear damage index versus (a) crack length, and (b) surface area of through-thickness and  
 342 non-penetrating cracks (the damage index of the through-thickness crack increases linearly against  
 343 crack length, while that of the non-penetrating crack increases in parabolic advance; when plotted with  
 344 respect to crack surface area, the indices of both the through-thickness and non-penetrating cracks vary  
 345 linearly).

346

347 As observed in **Fig. 6(a)**, *NI* increases proportionally with the crack length for a penetrating  
 348 crack, while it increases in parabolic advance for a non-penetrating crack. This can be  
 349 attributed to the fact that the surface area of a penetrating crack increases linearly as the  
 350 crack progresses; it is therefore that the magnitude of CISS and *NI*, both of which are  
 351 proportional to the crack surface area, consequently increase linearly with respect to the  
 352 crack length. In contrast, a non-penetrating crack progresses in both the length and depth  
 353 directions simultaneously, leading to a parabolic relationship between the crack length (or  
 354 depth) and the surface area, and showing an increase of *NI* against the crack length (or depth)  
 355 in parabolic advance. On the other hand, when plotted with regard to the crack surface area,  
 356 **Fig. 6(b)**, *NI*, for both the penetrating and non-penetrating cracks, varies proportionally to  
 357 the surface area, and this observation tallies with the conclusion drawn in above theoretical  
 358 analysis (Section 2.1.1) that the nonlinear damage index is proportional to the crack surface  
 359 area. FE simulation results demonstrate the feasibility of using the proposed nonlinear

360 damage index for evaluating the area of a fatigue crack quantitatively, for both penetrating  
361 and non-penetrating scenarios.

362

## 363 **2.2 Offline Phase: Crack Growth Prediction**

364 The 3-D, non-penetrating crack investigated in the above FE simulation is quarter-circular  
365 in shape, and its length is identical to the depth initially. It is important to articulate that the  
366 growth rates of a non-penetrating fatigue crack along its length and depth are different in  
367 general, due to the different stress states at the crack front. In reality, a corner crack is usually  
368 quarter-elliptical and its aspect ratio (*i.e.*, the ratio of crack depth to length) is variable during  
369 crack progress [61]. To continuously evaluate of the length and depth of the fatigue crack  
370 that has already been identified using the above online phase, the shape evolution of the  
371 crack is further predicted using the second step of the proposed modeling framework – the  
372 *offline phase*. In this phase, no probing GUW is generated to interact with the crack. The  
373 core of the *offline phase* is a crack growth model, with which a relationship between the  
374 respective increase in the crack length and in the crack depth can be achieved, according to  
375 the updated crack size obtained from the *online phase*. This enables continuous depiction of  
376 the crack growth. It is such continuous update and monitoring of the crack growth that makes  
377 this two-step framework outperforms conventional approaches which only predict the  
378 fatigue crack growth based on the initial crack size.

379

### 380 **2.2.1 Shape Evolution of a Non-penetrating Crack**

381 The growth of a 2-D, through-thickness crack through its fatigue life can be determined in  
382 terms of the Paris's law and the classical Paris-Erdogan equation, as

$$383 \quad \frac{dl}{dN} = C(\Delta K)^n, \quad (8)$$

384 where  $l$  is the crack severity (length or depth) and  $N$  is the cycle number of the fatigue load.  
 385  $\frac{dl}{dN}$  signifies the crack growth increment in a single fatigue load cycle, and  $\Delta K$  the *stress*  
 386 *intensity factor* (SIF) *range* at the crack tip which is known to be the main driving force  
 387 leading to continuous crack growth.  $C$  and  $n$  are the Paris's law parameters related to  
 388 fatigue properties of the material. An accurate SIF at the crack front guarantees faithful  
 389 characterization of crack evaluation.

390

391 A predictive model, taking the effect of crack closure phenomenon into consideration, is  
 392 developed in the offline phase, to estimate the respective progress in length and depth of a  
 393 3-D, non-penetrating fatigue crack. The model resides on a twofold hypothesis:

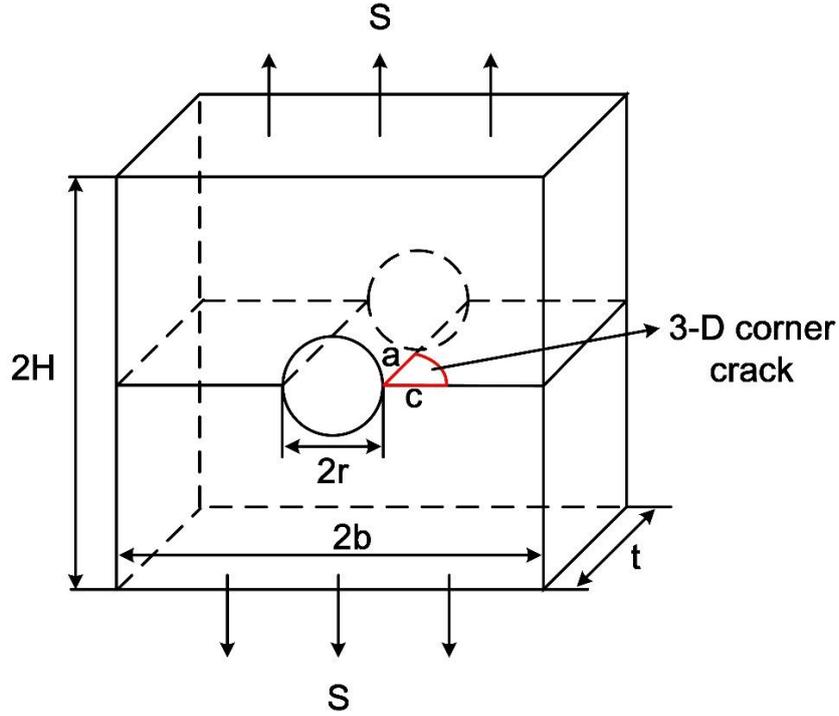
- 394 1) the shape of the non-penetrating fatigue crack remains a semi-ellipse for a surface  
 395 crack, and a quarter-ellipse for a corner crack; and
- 396 2) the growth direction of all points on the crack front in a fatigue cycle is perpendicular  
 397 to the crack front, from which the crack initiates.

398

399 Taking a quarter-elliptical corner crack at a fastener hole as an example, **Fig. 7**, the SIF ( $K$ )  
 400 of each point on the crack front can be calculated in terms of the Newman-Raju empirical  
 401 equation as follows [62]

$$402 \quad K = S \sqrt{\pi \frac{a}{Q}} F\left(\frac{a}{c}, \frac{a}{t}, \frac{r}{t}, \frac{r}{b}, \frac{c}{b}, \phi\right), \quad (9)$$

403 where  $S$  is the external applied stress;  $\phi$  is the parametric angle of the quarter-elliptical  
 404 crack front;  $a$  and  $c$  are the depth and length of the crack, respectively;  $t$  denotes the  
 405 thickness of the waveguide;  $2b$  and  $2H$  are the width and height of the waveguide,  
 406 respectively;  $r$  is the radius of the fastener hole, and  $Q$  an empirical shape factor for a  
 407 quarter-elliptical corner crack.



408  
409 **Figure 7.** Schematic of a quarter-elliptical corner crack at a fastener hole.  
410

411 Taking the plasticity-induced fatigue crack closure into account [63], which originates from  
412 the stress singularity at the crack tip, the SIF range,  $\Delta K$ , used for calculating crack growth  
413 in Eq. (8), is replaced by the effective SIF range,  $\Delta K_{eff}$ , which is defined as the difference  
414 in two SIFs respectively calculated under the maximum stress of the fatigue load and the  
415 crack opening stress.  $\Delta K_{eff}$  has proven effectiveness in describing crack growth when the  
416 crack is embryonic. For fatigue crack growth subject to a constant fatigue load, the crack  
417 opening stress can be determined based on a strip yield model [64], as

418 
$$\frac{S_{open}}{S_{max}} = \begin{cases} A_0 + A_1 R & R < 0 \\ A_0 + A_1 R + A_2 R^2 + A_3 R^3, & R \geq 0 \end{cases} \quad (10)$$

419 where

$$A_0 = (0.825 - 0.34\alpha + 0.05\alpha^2)[\cos(\pi S_{max} / 2\sigma_0)]^{1/\alpha}$$

$$A_1 = (0.415 - 0.071\alpha)S_{max} / \sigma_0$$

$$A_2 = 1 - A_0 - A_1 - A_3$$

$$A_3 = 2A_0 + A_1 - 1.$$

420

421 In the above,  $S_{open}$  and  $S_{max}$  are the crack opening stress and the maximum stress of the  
 422 fatigue load, respectively.  $R$  is the stress ratio of the fatigue load;  $\sigma_0$  is the flow stress of  
 423 the waveguide which is taken as the average of the yielding stress and ultimate tensile  
 424 strength of the material, and  $\alpha$  is the stress constraint factor at the crack tip.

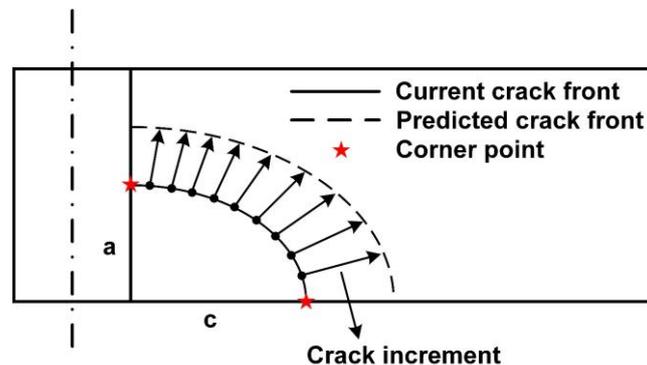
425

426 In the model, the crack front is discretized into a series of points, as shown schematically in  
 427 **Fig. 8**, and respective increment of these discrete points as crack progresses, upon  
 428 considering the effect of plastic-induced crack closure phenomenon, can be determined  
 429 using Eq. (8) upon replacing  $\Delta K$  with  $\Delta K_{eff}$ , as follows

$$\Delta K_{eff} = K_{max} - K_{open} = \Delta K \left( \frac{1 - S_{open} / S_{max}}{1 - R} \right). \quad (11)$$

431 Based on the calculated crack growth increment of each discrete point on the crack front,  
 432 and the propagation direction as specified in the second hypothesis in the above, the new  
 433 position of each discrete point upon a single fatigue cycle can be predicted using the model.  
 434 With a least square method, the newly formed crack front after a fatigue cycle can be fitted,  
 435 and the length and depth of the crack can be ascertained accordingly.

436



437

438

439 **Figure 8.** Crack front prediction as crack progresses using the proposed model (the current crack front  
440 is discretized into a series of points and crack increment of each point is calculated based on the Paris-  
441 Erdogan equation; the least square method is adopted to fit the newly formed crack front).

442

### 443 **2.2.2 Model Validation**

444 To verify the model, the growth and shape evolution of a series of quarter-elliptical corner  
445 cracks initiated from a fastener hole are predicted, and the predicted results are compared  
446 with those reported elsewhere [65]. The considered waveguide features a width ( $2b$ ) of 80  
447 mm, a height ( $2H$ ) of 500 mm and a thickness ( $t$ ) of 5 mm. Six quarter-elliptical corner  
448 cracks, each of which has a different initial aspect ratio ( $a/c$ ), respectively emanating from  
449 the fastener hole of different radii ( $r/t = 0.5, 1.0$  and  $3.0$ , see **Fig. 7**) are considered. Initial  
450 depth, length and aspect ratio of the six corner cracks, respectively denoted by  $a_0$ ,  $c_0$  and  
451  $(a/c)_0$ , are summarized in **Tab. 2**. Note that the two particular corner points on the crack  
452 front, as asterisked in **Fig. 8**, should be excluded during SIF calculation, as Eq. (9) is not  
453 applicable to these two points.

454

455 **Table 2.** Initial crack parameters in validation.

| $(a/c)_0$  | 1.0 | 1.2    | 1.4    | 1.6   | 1.8    | 2.0 |
|------------|-----|--------|--------|-------|--------|-----|
| $a_0$ (mm) | 1.0 | 1.0    | 1.0    | 1.0   | 1.0    | 1.0 |
| $c_0$ (mm) | 1.0 | 0.8333 | 0.7143 | 0.624 | 0.5556 | 0.5 |

456

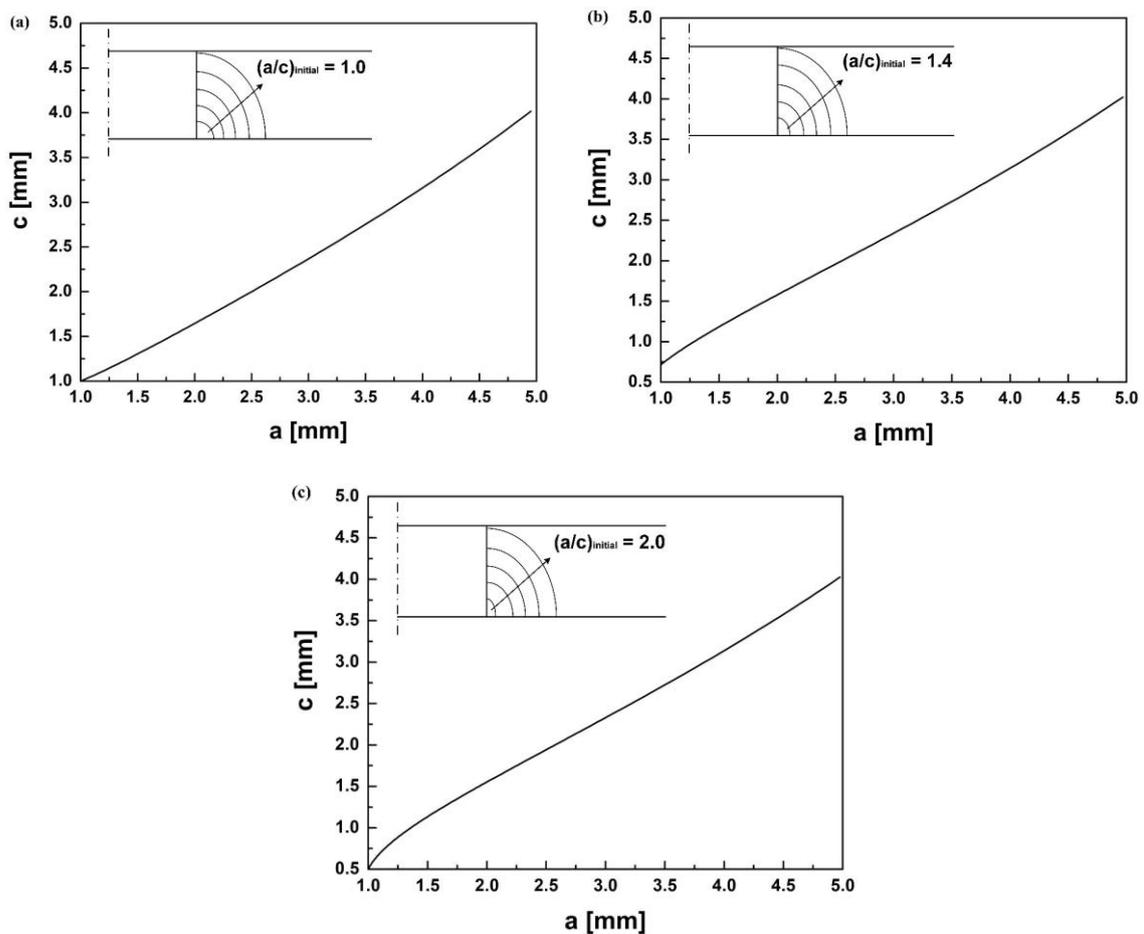
457 As representative results, **Fig. 9** shows the correlation between the crack length and depth,  
458 as well as the shape evolution of three corner cracks when their initial aspect ratios are 1.0,  
459 1.4 and 2.0, respectively, obtained using the predictive model in the offline phase. The  
460 predicted changes in the crack aspect ratio are compared with those obtained elsewhere [65],

461 in **Fig. 10**, to observe quantitative accordance. In [40], the shape evolution of the same corner  
462 cracks under the same loading conditions is simulated using an FE approach.

463

464 In conclusion, the predicted results using the predictive model for the progress of a non-  
465 penetrating crack, at different initial aspect ratios and from a fastener hole of various radii,  
466 quantitatively tally with the earlier results, demonstrating the validity of the proposed 3-D  
467 crack growth model in predicting the growth and shape evolution of 3-D, non-penetrating  
468 fatigue cracks. With the predicted crack shape evolution, a quantitative correlation between  
469 the length and depth of a non-penetrating crack can further be established in the offline phase.

470



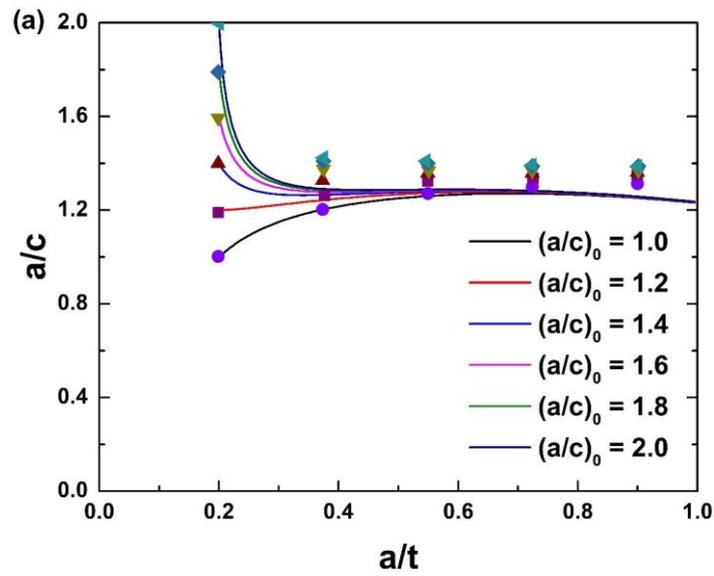
472

473 **Figure 9.** Predicted correlation between crack length and depth, and shape evolution (insert) of quarter-  
474 elliptical corner cracks using the predictive model in the offline phase, when (a)  $(a/c)_0 = 1.0$ ; (b)

475

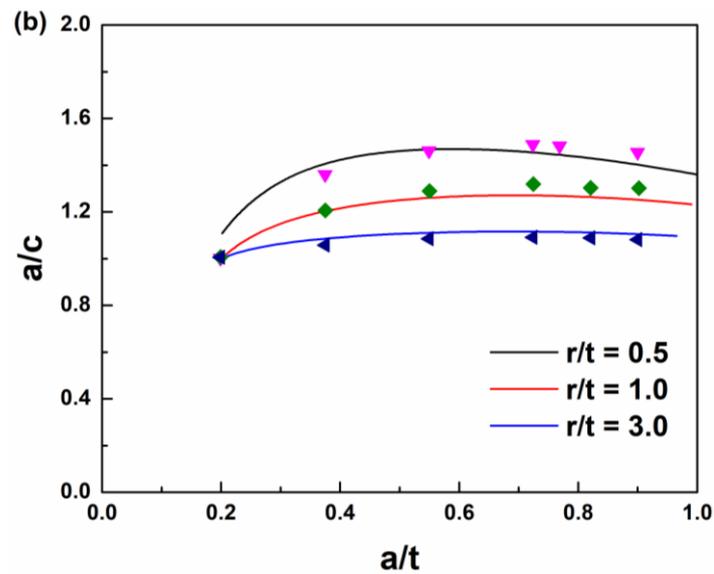
$(a/c)_0 = 1.4$ ; and (c)  $(a/c)_0 = 2.0$ .

476



477

478



479

480 **Figure 10.** Predicted changes in aspect ratio of quarter-elliptical corner cracks, when (a) the crack is of  
481 different initial aspect ratios; and (b) the fastener hole is of different radii (curves: prediction based on  
482 the Newman-Raju equation [62]; dots: prediction by [40]).

483

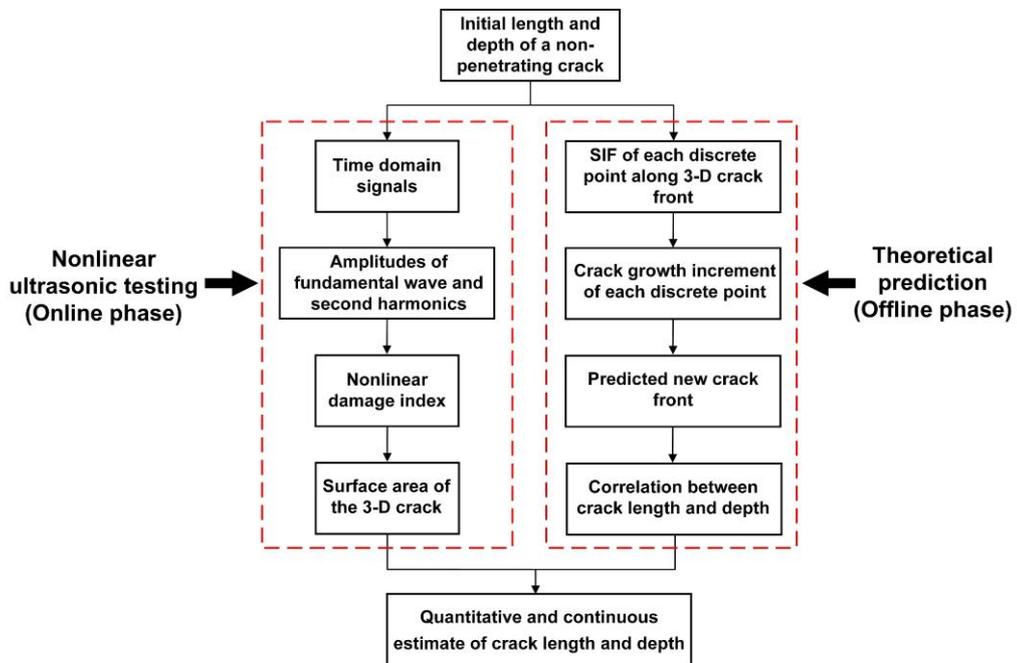
484

### 485 2.3 Integrity of Online and Offline Phases

486 In the online phase, an analytical model based on the theory of elastodynamics sheds light

487 on the generation of CAN in the probing GUWs under the modulation of the ‘breathing’

488 behavior of a non-penetrating fatigue crack, on which basis a crack-area-dependent damage  
 489 index is created. Subsequent to the online phase, the fatigue crack growth model in the  
 490 offline phase predicts further growth of the identified fatigue crack in its length and depth,  
 491 based on the updated crack size obtained from the online phase, and establishes the  
 492 relationship between the crack length and depth for later prediction. With both the online  
 493 and offline phases, continuous and quantitative evaluation of non-penetrating fatigue crack  
 494 is implemented. The schematic flowchart of the integrated two-step modeling framework is  
 495 shown in Fig. 11.



497  
 498 **Figure 11.** Flowchart of the developed two-step modeling framework for continuous monitoring and  
 499 estimate of 3-D fatigue cracks, from initiation through growth (left column showing the online phase to  
 500 identify crack surface area using nonlinear ultrasonic testing; right column showing the offline phase to  
 501 predict change in aspect ratio and shape evolution of crack with 3-D crack growth model.  
 502

503  
 504 With the crack surface area that is estimated in the online phase and the correlation between  
 505 the length and depth of the crack in the offline phase, the progress of a fatigue crack, from  
 506 embryonic initiation, through progressive growth to the formation of macroscopic crack, can

507 be evaluated quantitatively. It is noteworthy that no external loadings are included in  
508 modeling. For this sake, in practical implementation, the framework shall ideally be used in  
509 such a context.

510

### 511 3. Proof-of-Concept Experiment

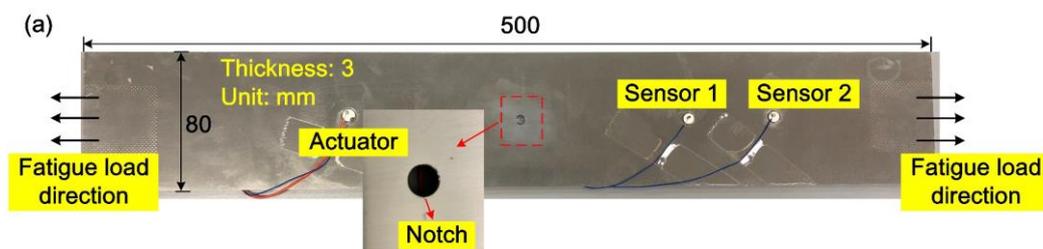
512 Experiment is performed to validate the developed two-step modeling framework, by  
513 quantitatively evaluating a non-penetrating fatigue crack and continuously predict its growth  
514 under a fatigue load, until its formation into a macroscopic through-thickness crack. The  
515 experiment contains two hierarchical steps: 1) fatigue testing that drives the initial corner  
516 crack to progress under the fatigue load; and 2) nonlinear GUW-based testing that achieves  
517 continuous monitoring of the crack. **Figure 12** presents the pictured specimen and the  
518 schematic illustration of the nonlinear ultrasonic testing.

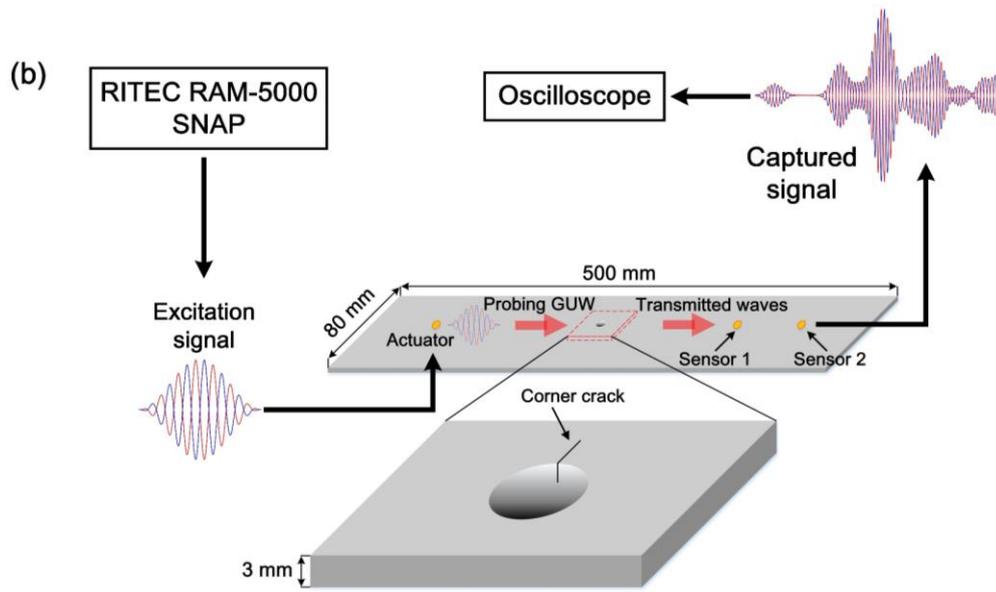
519

#### 520 3.1 Fatigue Crack Growth Testing

521 An aluminium plate-like specimen (Aluminium 7075-T6; 500 mm long, 80 mm wide and 3  
522 mm thick) is pre-treated with a through-thickness fastener hole (diameter: 6 mm) at the  
523 center of the specimen. To initiate a non-penetrating fatigue crack from the fastener hole  
524 edge, a tiny triangular notch, approximately 0.65 mm in its length and depth, respectively,  
525 is inscribed on the fastener hole edge in the plane perpendicular to the fatigue load direction.

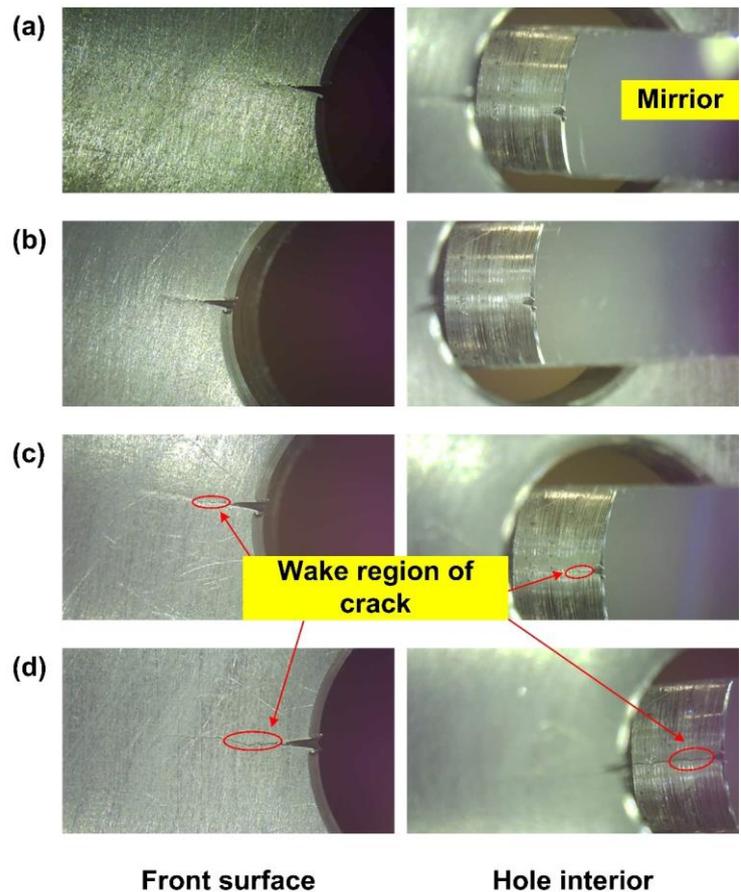
526





527  
 528 **Figure 12.** (a) Pictured specimen used in the fatigue testing (a PZT wafer functioning as GUV actuator  
 529 and another two PZT wafers as sensors to capture wave signals); and (b) schematic of the nonlinear  
 530 ultrasonic testing.  
 531

532 The crack growth testing is conducted on a fatigue testing platform (GP SDF2000). A 10 Hz  
 533 pre-cracking cyclic load with the maximum tensile load of 30 kN and the stress ratio of 0.1  
 534 is applied, under which a corner crack is initiated from the tip of the inscribed notch on the  
 535 fastener hold edge. The length and depth of the corner crack are real-time measured with a  
 536 microscope and a flexible mirror inserted into the fastener hole, see **Fig. 13**. After the pre-  
 537 cracking process, a quarter-elliptical corner crack is generated at the notch tip with ~1.0 mm  
 538 in its length and depth, respectively. Subsequently, the cyclic load is regulated to 2~20 kN  
 539 with a frequency of 10 Hz, to perform fatigue crack growth testing. The test is paused every  
 540 1,000 cycles; the length and depth of the corner crack are measured, and the nonlinear  
 541 ultrasonic testing is performed during every pause. The test is terminated at 10,000 cycles,  
 542 when the fatigue crack is observed to penetrate the specimen thickness. Typical photographs  
 543 of the corner crack upon 0, 4,000, 8,000 and 10,000 load cycles are displayed in **Fig. 13**.



546

547 **Figure 13.** Photographs of the fatigue crack observed from the front surface of the specimen and from  
 548 inside the fastener hole, upon (a) 0; (b) 4,000; (c) 8,000; and (d) 10,000 load cycles (after pre-cracking  
 549 process, initial fatigue crack is generated; progress of the non-penetrating crack along the length and  
 550 depth is observed at 4,000 and 8,000 load cycles, and a through-thickness crack is formed at 10,000  
 551 load cycles).

552

553

### 554 3.2 Quantitative Identification of Progressive Fatigue Crack (Online Phase)

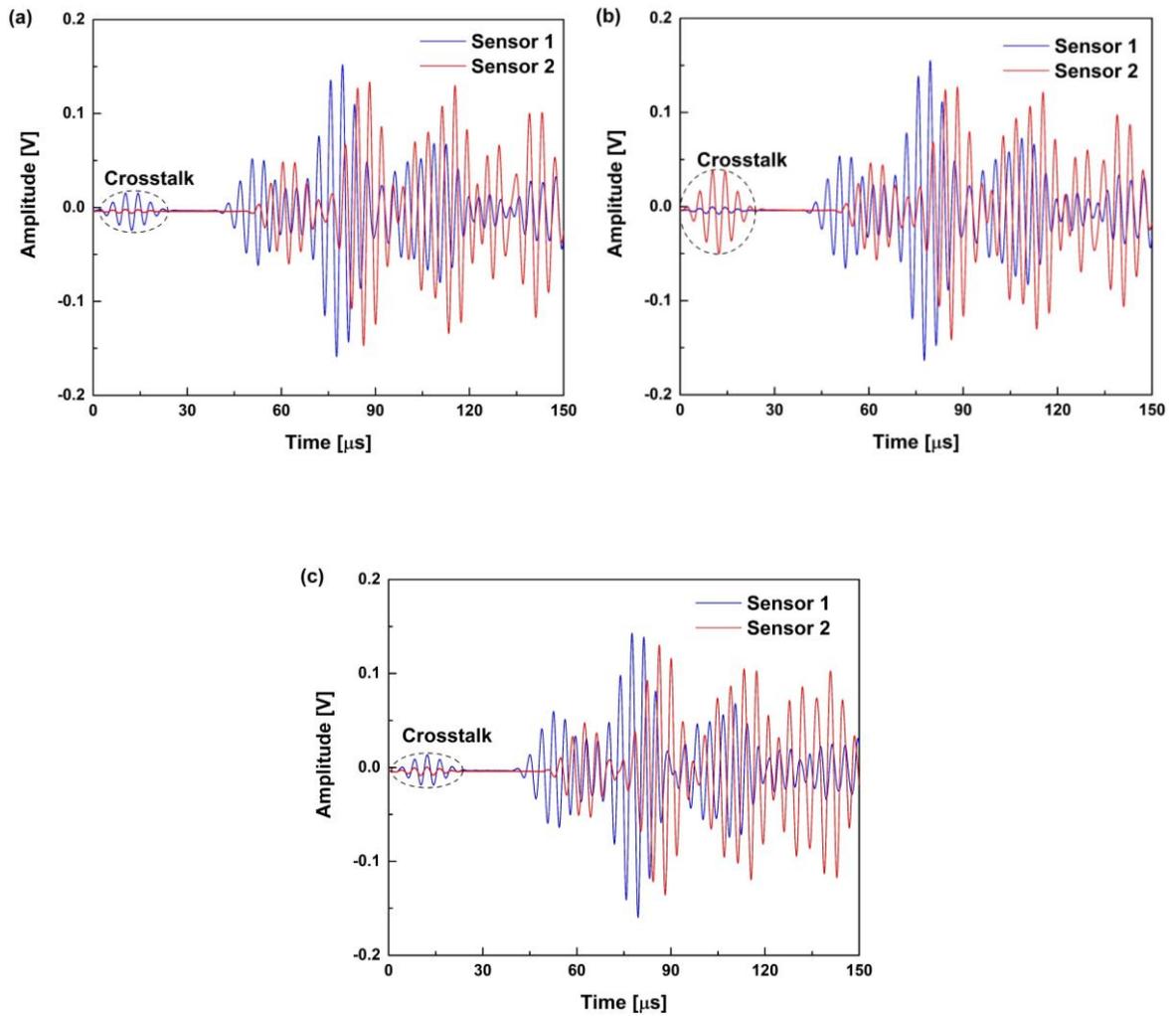
555 During the pause of the fatigue crack growth testing (every 1,000 cycles), the nonlinear  
 556 ultrasonic testing is carried out to capture and calibrate CAN induced by the ‘breathing’  
 557 crack. A lead zirconate titanate (PZT) wafer (PSN-33, diameter: 8 mm; thickness: 0.48 mm)  
 558 is mounted on the surface of the specimen, 100 mm from the center of the fastener hole,  
 559 which functions as a wave actuator to excite the probing GUW; two PZT wafers, same as  
 560 the one used as the actuator, are mounted on the specimen 100 mm and 150 mm from the  
 561 fastener hole, respectively, serving as the wave sensors, as shown in **Fig. 12**. All the three

562 PZT wafers are mounted on the specimen after the pre-cracking process, so that possible  
563 debonding between PZT wafers and the specimen can be avoided. A high-power ultrasonic  
564 testing system (RITEC<sup>®</sup>, RAM-5000 SNAP) is used to generate an Hanning-windowed 5-  
565 cycle sinusoidal toneburst at a central frequency of 250 kHz. Due to the small dimensions of  
566 the corner crack, the energy level of the incident GUWs is sufficient to modulate the crack  
567 and drive it to present ‘breathing’ behavior. The GUWs, upon interaction with the crack, are  
568 captured via two sensors with an oscilloscope at the sampling frequency of 200 MHz. Signals  
569 are averaged for 1,024 times to minimize the measurement uncertainty.

570

571 **Figure 14** illustrates the GUW signals captured by two sensors upon 0, 4,000 and 8,000 load  
572 cycles. The variation in amplitudes of signals captured through the fatigue crack growth is  
573 within a small range of ~10%, implying a stable bonding condition between the PZT wafers  
574 and the specimen during the fatigue testing. This also argues that the change in signal  
575 amplitude – a linear feature of the GUW, is not sensitive to a fatigue crack in its embryonic  
576 stage. By using the pulse-inversion technique detailed in Section 2.1.2, the second order  
577 harmonics generated by the ‘breathing’ fatigue crack are obtained. **Figures 15(a)-(c)** show  
578 the signal spectra, captured by Sensor 2, as an example, upon 0, 4,000 and 8,000 load cycles  
579 applied, in which the crack-induced second order harmonics are observed. **Figure 15(d)**  
580 illustrates the amplitude of the second order harmonics at double excitation frequency (*i.e.*,  
581 500 kHz), and it is apparent that the signal amplitude increases with respect to the number  
582 of load cycles.

583



584

585

586

587

588 **Figure 14.** GUV signals captured by two sensors upon (a) 0; (b) 4,000; and (c) 8,000 load cycles  
 589 (variation in amplitudes of signals captured through the fatigue crack growth is within a small range of  
 590 ~10%, confirming a stable bonding condition between the PZT wafers and the specimen during the  
 591 fatigue testing, and the change in signal amplitude (linear GUV feature) is not sensitive to incipient  
 592 fatigue crack).

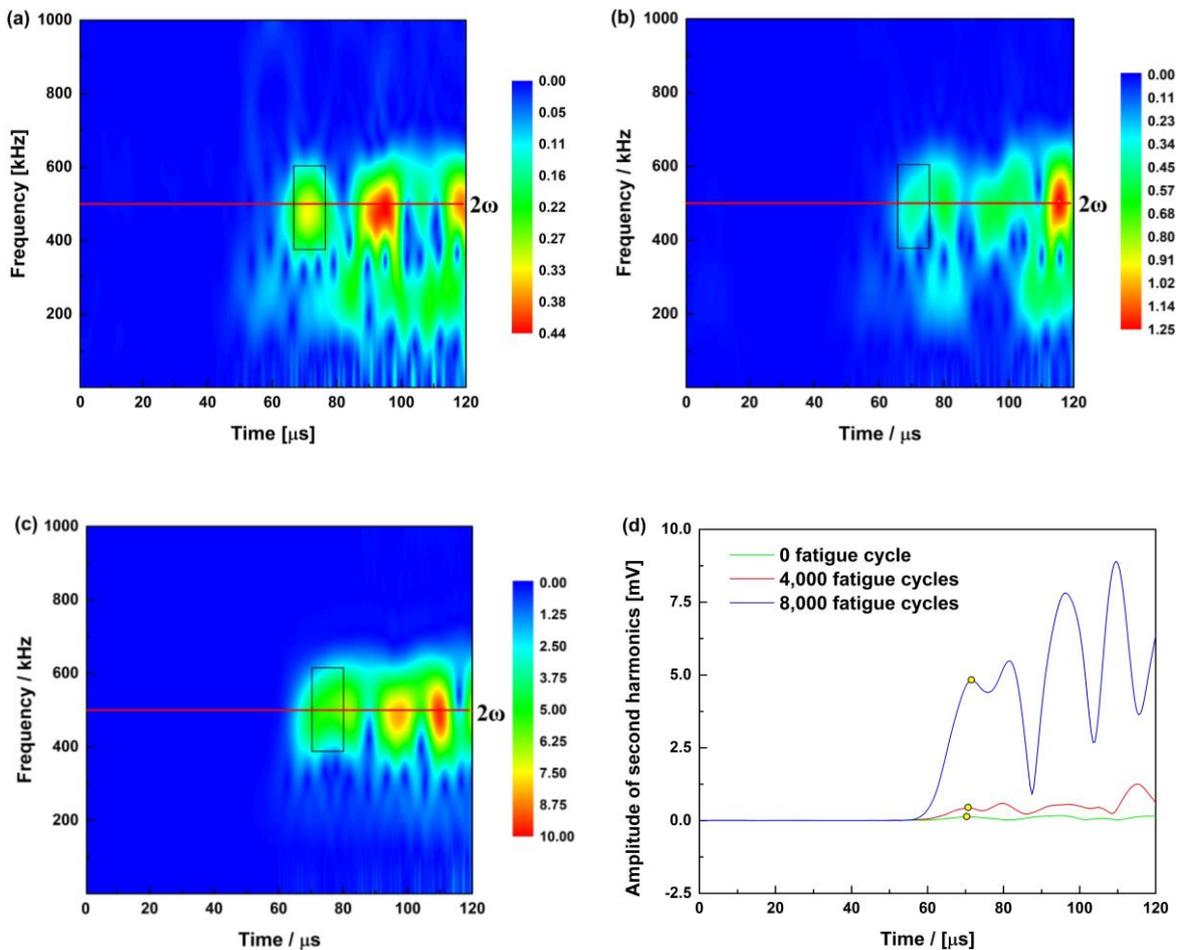
593

594

595 Based on the amplitudes of the captured GUV signals at fundamental frequency and of the  
 596 second order harmonics at double excitation frequency, the nonlinear damage index is  
 597 calculated using Eq. (7). Further, the relationship between the calculated index and the crack  
 598 surface area (calculated with experimentally measured crack length and depth) is obtained,  
 599 in **Fig. 16**.

600

601



602

603

604

605

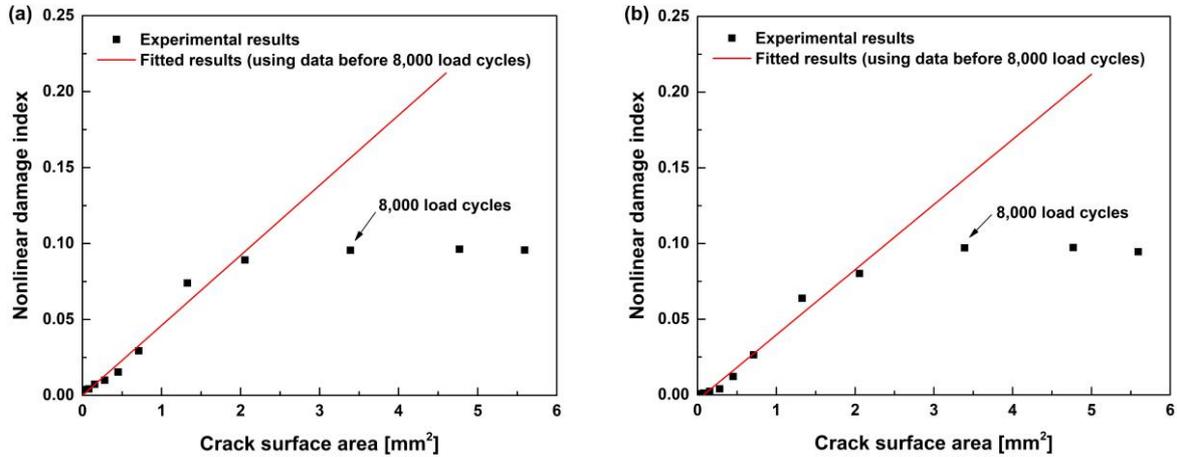
606 **Figure 15.** Spectra of signals captured by Sensor 2 (after applied with pulse-inversion technique), upon  
607 (a) 0; (b) 4,000; and (c) 8,000 load cycles; (d) amplitudes of the second order harmonics.

608

609 Note that in **Fig. 16**, the area of the crack surface generated in the pre-cracking stage (see  
610 Section 3.1) has been subtracted from the measured crack surface area, because it is not  
611 included in the correlation between the damage index and the severity of a fatigue crack in  
612 the modeling (Section 2). In **Fig. 16**, a proportional relationship between the calculated index  
613 and the measured crack surface area is observed, before the fatigue cycles reach 8,000, under  
614 which the crack surface area is smaller than 2 mm<sup>2</sup> and it represents an embryonic crack.  
615 The experimental results corroborate the conclusions that are drawn earlier from the  
616 analytical modeling and FE simulation in Section 2.1.2, not only verifying the proposed

617 analytical modeling, also demonstrating the validity of the defined nonlinear damage index  
618 for evaluating the crack surface area.

619



620

621

622 **Figure 16.** Nonlinear damage index calculated using signals captured by (a) Sensor 1; and (b) Sensor 2,  
623 versus experimentally measured crack surface area.

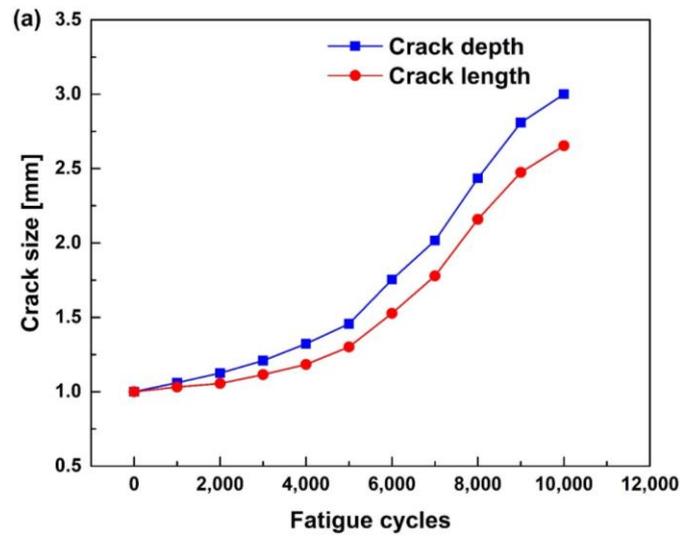
624

625 The indices obtained at 8,000 load cycles afterwards are lower than the fitted results, which  
626 can be attributed to two reasons: 1) the corner crack has grown to a considerable size after  
627 8,000 load cycles and the crack opening displacement in the wake region of the crack is too  
628 large to present the ‘breathing’ behavior; 2) the compressive residual stress is generated at  
629 the crack tip as a result of the plastic deformation, which partly restrains the ‘breathing’  
630 behavior of the fatigue crack.

631

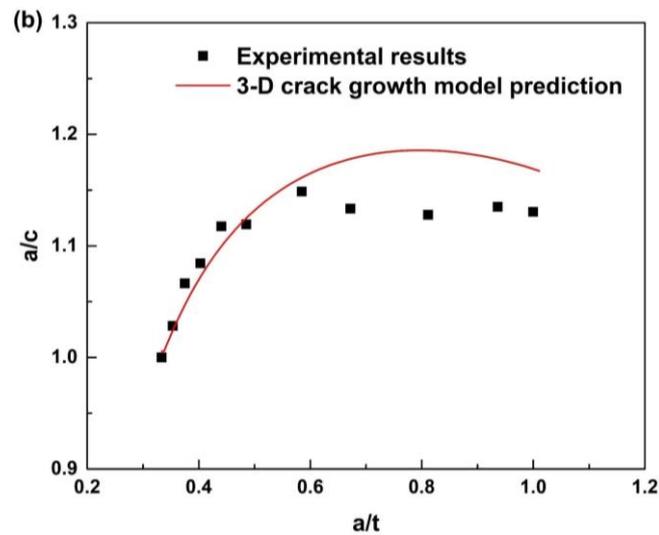
### 632 **3.3 Continuous Estimate of Progressive Fatigue Crack (Offline Phase)**

633 To continuously estimate the crack growth along crack front, the offline phase is recalled to  
634 predict the change in aspect ratio of the corner crack as well as the crack shape evolution.  
635 Predicted results are presented in **Fig. 17**, compared with counterpart results experimentally  
636 measured, to observe good agreement.



637

638



639

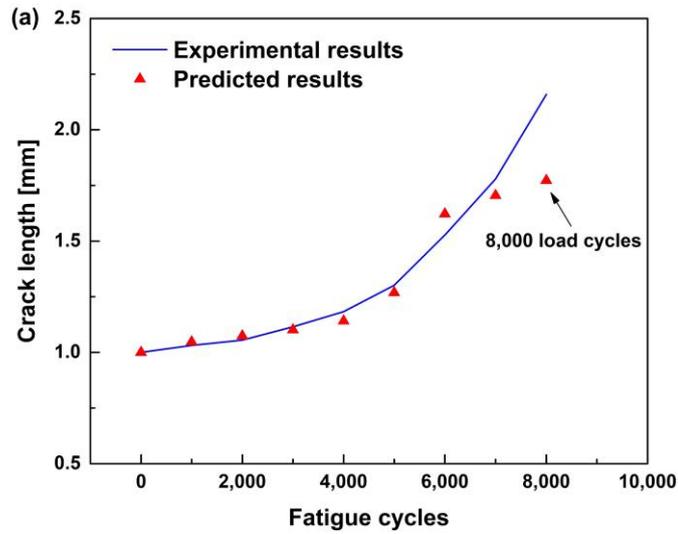
640

641 **Figure 17.** (a) Experimentally measured crack length and depth during its growth; (b) comparison  
 642 between measured and predicted aspect ratios.

643

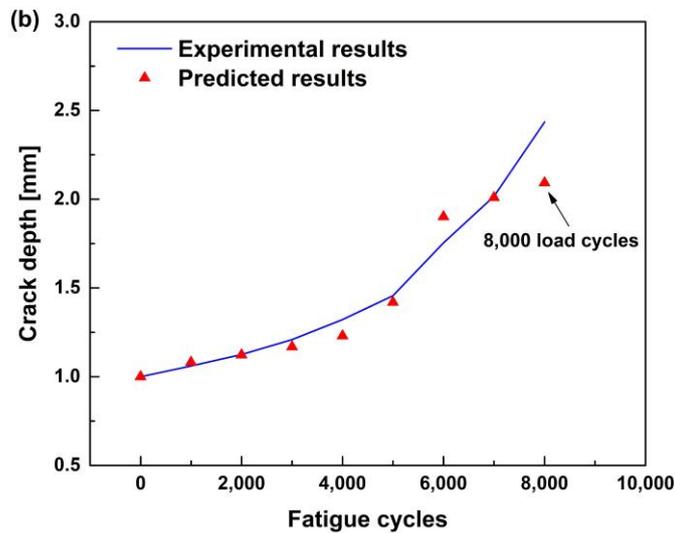
644 Combining the online and offline phases, **Fig. 18** shows the predicted length and depth of  
 645 the corner crack, compared with experimentally measured results. The coincidence between  
 646 predicted results and the reality has demonstrated that the two-step modeling framework is  
 647 capable of identifying fatigue cracks at their embryonic stages (<8,000 fatigue load cycles),  
 648 and predicting their growth along crack fronts, quantitatively and continuously.

649



650

651



652

653 **Figure 18.** Experimentally measured (a) length and (b) depth of the corner crack during its growth,  
 654 compared with predicted results using the modeling framework.

655

656

657 **4. Concluding Remarks**

658 It is of great significance yet a challenge to estimate fatigue cracks in engineering structures  
 659 in their early stages. In this study, a two-step modeling framework, consisting of an online  
 660 phase and an offline phase, is developed, which aims at continuously monitoring and  
 661 quantitatively evaluating non-penetrating fatigue cracks. In the online phase, the ‘breathing’

662 crack-induced CAN is investigated analytically, by considering the nonlinear modulation of  
663 a fatigue crack on a probing GUV. A nonlinear damage index is defined and proven  
664 proportional to the crack surface area, highlighting the capability of the index for  
665 characterizing crack surface quantitatively. To predict growth of the identified fatigue crack  
666 in its length and depth along the crack front, a 3-D fatigue crack growth model is proposed  
667 in the offline phase. By investigating the crack growth increments of discrete points at the  
668 crack front, the growth of the crack along its crack front can be predicted, and the relationship  
669 between the length and depth of the crack is established. Proof-of-concept experiment is  
670 performed to validate the modeling framework. Good coincidence between the model-  
671 predicted and experimental results confirms the validity of the proposed two-step modeling  
672 framework for continuous monitoring and quantitatively evaluating fatigue cracks, from  
673 their embryonic initiation, through progressive growth to formation of macroscopic cracks.

674

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680

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