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1 3D SLDV and combines it with a Multiple-Input-Single-Output (MISO) vibration controller to deal with nonlinear 2 structures. An advanced test strategy is introduced, which is capable of obtaining amplitude-dependent resonant 3 frequencies, modal damping ratios and full-field, multi-harmonic mode shapes of nonlinear normal modes (NNMs). 4 Conflicting parameters such as the frequency resolution and measurement time are optimised by combining phase 5 separation and phase resonance testing techniques in a coherent strategy. The capabilities of the proposed nonlinear modal 6 testing strategy are demonstrated on a realistic, large-scale fan blade that exhibits softening behaviours. Two of its NNMs 7 were investigated at larger vibration amplitudes. Its nonlinear modal parameters were successfully extracted and validated, 8 highlighting the time efficiency and data accuracy of the proposed strategy for measuring industrial-scale, lightweight 9 nonlinear structures.

10 Keywords: 3D SLDV, advanced test strategy, full-field measurement, lightweight nonlinear structures.

11 I. Introduction

12 The drive towards more optimised design for improved fuel efficiency and reduced carbon emissions has led to even 13 thinner, slender and lighter aerospace structure designs. These newly developed structures are expected to undergo harsher 14 loads and experience much larger deformations, resulting in stronger nonlinear vibrations. In this regard, conventional 15 linear modal testing techniques and measurement equipment need to be extended to accommodate these nonlinearities, 16 such as identifying amplitude-dependent modal properties or measuring multi-harmonic responses.

17 Many researchers attempt to combine the nonlinear modal testing techniques and the contact transducers such as 18 accelerometers or strain gauges in vibration testing of nonlinear structures. One type of such test is to resort to phase 19 separation testing techniques, which involve measuring nonlinear Frequency Responses (FRs) or Frequency Response 20 Functions (FRFs) using stepped-sine or slowly swept-sine excitations at multiple input levels. Then, the nonlinear modal 21 frequency and damping ratio could be simultaneously identified by curve-fitting a nonlinear modal model to the frequency 22 response curves [1,2]. In the test, constant input force is **routinely** required when measuring such curves. Recently, it has 23 been relaxed in Refs [3,4]. From another perspective, the response of the nonlinear structural responses could be

1 and time efficiency are vital challenges when measuring nonlinear structural vibrations. Many researchers used it to 2 measure nonlinear FRFs of a single point [24,25] and showed that it is sufficient to identify nonlinear resonant frequency 3 and damping ratios of a complex structure. When spatially detailed vibration patterns are of interest, Continuous Scanning 4 Laser Doppler Vibrometry (CSLDV) [26] was first introduced. Ehrhardt et al. [27,28] presented initial works on the full-5 field measurements of nonlinear structures using a Three-dimensional DIC system and a CSLDV. It was shown that up 6 to 6 harmonics of the deformation shapes of a nonlinear beam or plate could be extracted; the higher-order harmonics 7 were found to be smaller than the measurement resolution, hindering the application of this technique to estimate high-8 frequency vibrations of test structures. The three-dimensional Scanning Laser Doppler Vibrometry (3D SLDV) is another 9 laser-based equipment that has been considered in the full-field measurement of aerospace structures of various sizes, 10 frequency ranges, and geometrical complexities [29]. Its full-field measurement applications were previously limited to 11 linear structures. Recently, the authors of this paper removed this limitation by developing a multi-step Interpolated-FFT 12 procedure [19] to estimate multiple harmonics from super-short sampling intervals. However, such a measurement 13 procedure needs to be integrated into a vibration test strategy in order to identify the nonlinear modal properties accurately 14 and efficiently.

15 This paper proposes a test setup for the full-field measurement of nonlinear modal parameters using 3D SLDV. The 16 setup combines the 3D SLDV with a Multiple Input Single Output (MISO) vibration controller, where the former 17 performs non-contact, full-field measurements, and the latter **applies** dedicated input forces. Based on the test setup, a 18 full-field nonlinear modal testing strategy consisting of three phases is proposed to quantify the nonlinear modal 19 parameters of the test structure. In Phase I, conventional full-field linear modal testing is conducted using low-amplitude 20 excitations to measure the natural frequencies, damping ratios and full-field mode shapes of the underlying linear system. 21 Phase II then detects the NNMs of the structure and **applies** a fast nonlinear phase resonance test to track the backbone 22 curve of each NNM; the amplitude-dependent modal frequencies and damping ratios are then extracted from the test data. 23 A sine-dwell test is subsequently performed along the backbone curve, and the full-field, multi-harmonic mode shapes 24 are estimated using measured datasets of 3D SLDV. A validation step for the extracted nonlinear modal parameters is 1 carried out at the end of Phase Ⅱ. Finally, in Phase Ⅲ, the integrity of the test structure is checked to ensure that no 2 recognisable damage occurs during the testing campaign. The proposed strategy is applied to an aero-engine fan blade 3 with complex three-dimensional curvature, demonstrating that it allows for time-efficient and accurate extraction of full-4 field modal parameters with fine frequency and spatial resolutions that meet stringent industry standards.

5 The following paper is organised as follows: Sec. Ⅱ details the theoretical background of nonlinear modal testing. 6 Sec. Ⅲ elaborates on the test setup and the proposed test strategy. Sec. Ⅳ illustrates the proposed strategy using an 7 industrial-scale fan blade, and Sec. V draws conclusions.

8 Ⅱ. Theoretical background

9 This paper considers the dynamics of a general structure with both stiffness and damping nonlinearities. After spatial 10 discretisation into an N-degree-of-freedom (N-DOF) system, its forced dynamic equation of motion can be written as:

$$
\mathbf{M}\ddot{\mathbf{u}} + \mathbf{C}\dot{\mathbf{u}} + \mathbf{K}\mathbf{u} + \mathbf{f}_{\mathrm{nl}}\left(\mathbf{u},\dot{\mathbf{u}}\right) = \mathbf{p}(t),\tag{1}
$$

12 where $\mathbf{M} \in \mathbb{R}^{N \times N}$, $\mathbf{C} \in \mathbb{R}^{N \times N}$, $\mathbf{K} \in \mathbb{R}^{N \times N}$ denote the mass, damping and stiffness matrices, respectively. Vectors 13 $\ddot{u} \in \mathbb{R}^{N \times 1}$, $\dot{u} \in \mathbb{R}^{N \times 1}$ and $u \in \mathbb{R}^{N \times 1}$ represent the acceleration, velocity and displacement, respectively. $p(t) \in \mathbb{R}^{N \times 1}$ is 14 the external excitation force vector applied to the test structure while $f_{nl}(u, \dot{u}) \in \mathbb{R}^{N \times 1}$ represents the internal nonlinear 15 force vector.

16 The proposed testing strategy is based on the concept of NNM and mode isolation testing techniques. A brief 17 overview of these techniques is provided, and derivations of the amplitude-dependent modal frequencies, modal damping 18 ratios, and mode shapes from the perspective of experimental modal analysis are presented.

19 A. Nonlinear Normal Mode

20 In analogous to *real normal mode* analysis of linear systems, the nonlinear modes of the associated undamped system 21 are sought first. To allow the computation of real nonlinear modes of a system, it is assumed that the nonlinear force 22 vector in Eq. (1) can be decoupled in the form of:

$$
1 \\
$$

$$
f_{\mathrm{nl}}(u,\dot{u})=f_{\mathrm{nl}}^{\mathrm{u}}(u)+f_{\mathrm{nl}}^{\mathrm{d}}(\dot{u}), \qquad (2)
$$

2 where $f_{nl}^u(u)$ and $f_{nl}^d(u)$ represent the conservative and dissipative internal nonlinear forces, respectively.

3 In this work, the definition of NNM proposed by Kerschen *et al.* [30] is used, where a NNM is defined as periodic 4 motion governed by the conservative, autonomous part of Eq. (1), i.e., $f_{nl}(u, \dot{u}) = f_{nl}^{u}(u) + f_{nl}^{d}(\dot{u}),$ (2)

and dissipative internal nonlinear forces, respectively.

lerschen *et al.* [30] is used, where a NNM is defined as periodic

of Eq. (1), i.e.,
 Mii + **Ku** + $f_{nl}^{u}(u) = 0$. (3)

5 **M** $\ddot{u} + K u + f_{nl}^{u}(u) = 0$. (3)

6 To compute the NNMs of Eq. (3), non-trivial solutions approximated by truncated Fourier series [30,31] are used:

$$
\boldsymbol{u}(t) = \text{Re}\bigg(\sum_{n=0}^{N_h} \tilde{\boldsymbol{\psi}}^{(n)} e^{jn\tilde{\omega}t}\bigg),\tag{4}
$$

Where $\tilde{\psi}^{(n)}$ denotes the real-valued, *n*-th harmonic mode shape, $\tilde{\omega}$ is the nonlinear modal frequency, N_h denotes the 9 maximum order of truncated harmonics, and $j = \sqrt{-1}$ denotes the imaginary unit. The notion $\tilde{\bullet}$ indicates that the 10 parameter is dependent on the vibration amplitude. The periodic motion definition of NNM implies that its mode shape 11 contains multiple harmonics, as represented by $\tilde{\psi}^{(0)}$, $\tilde{\psi}^{(1)}$, $\ldots \tilde{\psi}^{(N_h)}$. $u(t) = \text{Re}\left(\sum_{n=0}^{N_0} \tilde{\psi}^{(n)} e^{in\omega_n}\right),$
where $\tilde{\psi}^{(n)}$ denotes the real-valued, *n*-th harmonic mode shape, $\tilde{\omega}$ is the nonlinear modal frequency, *l*
maximum order of truncated harmonics, and $j = \sqrt{-1}$ denote $u(t) = \text{Re} \left(\sum_{r=0}^{\infty} \vec{w}^{(r)} e^{j\omega \omega} \right)$, (4)
 $\vec{\psi}^{(r)}$ denotes the real-valued, *n*-th harmonic mode shape, $\hat{\omega}$ is the nonlinear modal frequency, N_s denotes the

im order of truncated harmonics, and $j = \sqrt{-$

12 Inserting the truncated Fourier bases - Eq. (4) - into Eq. (3) and removing the time dependency with a Galerkin 13 projection, one gets a set of algebraic equations:

14
$$
\mathbf{Z}^{(n)}(\tilde{\omega})\tilde{\mathbf{y}}_n + \mathbf{F}_{\rm nl}^{\rm u(n)}(\tilde{\mathbf{U}}) = \mathbf{0}, \quad n = 0, 1, \cdots N_h. \tag{5}
$$

15 where $\mathbf{Z}^{(n)}(\tilde{\omega}) = -(\tilde{n}\tilde{\omega})^2 \mathbf{M} + \mathbf{K}$ are blocks of the dynamic stiffness matrix, $\tilde{\mathbf{U}} = \left[\tilde{\mathbf{\psi}}^{(0)}, \tilde{\mathbf{\psi}}^{(1)}, \cdots, \tilde{\mathbf{\psi}}^{(N_h)}\right]$ contains multi-16 harmonic mode shapes, and $F_{nl}^{u(n)}$ represents the complex amplitude of the multi-harmonic internal nonlinear forces. In 17 the computation of NNMs, Eq. (5) is solved via a continuation algorithm [30,32], while in this paper, the NNM 18 parameters will be directly estimated from test data.

19 B. Single-NNM Motion

20 It is supposed that the test structure is lightly damped and, in the test, each NNM is excited sequentially by a dedicated 21 external force (usually a single sinusoidal force), i.e.

$$
1 \\
$$

$$
p(t)=\text{Re}\left(\,pe^{j\Omega t}\right).
$$
\n⁽⁶⁾

2 where Ω is the driving frequency of the external force, and vector p represents the force amplitude.

3 It is subsequently assumed that the NNM is well-isolated; therefore, the single-NNM method can be applied to the 4 forced and damped dynamic equation - Eq. (1) - to reduce its dimension. Many variants of single NNM methods have 5 been proposed, such as the NNM motion which contains a primary harmonic term only [33] or multi-harmonic terms [34]. 6 This paper follows the latter assumption such that, using the near-resonant condition $\Omega \approx \tilde{\omega}_r$, the structural responses 7 are dominated by a single nonlinear mode with many harmonics: $p(t) = \text{Re}(pe^{i\alpha})$. (6)

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$$
\boldsymbol{u}(t) \approx \boldsymbol{u}_r(t) = \text{Re}\bigg(\sum_{n=0}^{N_h} \tilde{\boldsymbol{U}}_r^{(n)} e^{jn\Omega t}\bigg) = \text{Re}\bigg(\sum_{n=0}^{N_h} \tilde{\boldsymbol{\phi}}_r^{(n)} q_r e^{jn\Omega t}\bigg),\tag{7}
$$

9 where $\tilde{U}_r^{(n)}$ denotes the amplitude of the forced responses of the *r*th mode.

10 In Eq. (7), the deflection shape $\tilde{U}_r^{(n)}$ is linked to the normalised mode shape via the modal amplitude:

$$
\tilde{U}_r^{(n)} = \tilde{\phi}_r^{(n)} q_r, \tag{8}
$$

12 where q_r denotes the complex-valued amplitude of the r-th resonant NNM. $\tilde{\phi}$ represents the amplitude-dependent, 13 normalised nonlinear mode shape scaled from $\tilde{\psi}_r$, which is a real-valued vector. Note that several normalisation 14 approaches have been proposed for nonlinear mode shapes, of which the mass normalisation of the fundamental harmonic 15 shape [34] is often used in numerical analysis. However, using deflection shape $(\tilde{U}_r^{(n)})$ is preferred in experimental modal 16 analysis since it involves much less manipulation of test data. $\vec{U}_r^{(n)} = \vec{\phi}_r^{(n)} q_r$, (8)

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 $\vec{\psi}_r$, which is a real-valued vector. Note that several normalisation

le shapes, of which the mass normalisa

17 One advantage of the single-NNM method is that it allows reducing the forced and damped equation - Eq. (1) - onto 18 each NNM coordinate by means of the Ritz-Galerkin procedure [34,35], leading to a series of single-NNM dynamic 19 equations:

$$
20 \left(\left(\tilde{\omega}_r^2 - \Omega^2 \right) \tilde{m}_r + \mathbf{j} \tilde{c}_r \Omega \right) q_r = \left(\tilde{\boldsymbol{\phi}}^{(0)} \right)^{\mathrm{T}} \boldsymbol{p}, \tag{9}
$$

$$
21 \qquad \left(\left(\tilde{\omega}_r^2 - n^2 \Omega^2 \right) \tilde{m}_r + j n \tilde{c}_r \Omega \right) q_r = 0, \quad n = 2 \cdots N_h, \tag{10}
$$

1 where \tilde{m}_r and \tilde{c}_r denote the modal mass and modal viscous damping coefficient, respectively. The modal mass, 2 damping ratio and modal frequency for the r-th NNM are denoted using \bullet to indicate the amplitude dependency. Since 3 deriving an accurate damping model for a realistic structure is extremely difficult, this paper uses a nonlinear viscous 4 modal damping coefficient (\tilde{c}_r) in Eq. (9) to account for the energy dissipation. In fact, the modal viscous damping 5 model is only valid when the coupling damping terms between NNMs are negligible [9-17]. Fortunately, this assumption 6 has proven to be quite accurate and useful for a wide range of realistic structures [9-17].

7 A comprehensive derivation of the single-NNM reduction process can be found in Ref [34]. Herein, this paper uses 8 the single-NNM equation inversely to identify nonlinear modal parameters through experimental test data.

9 C. Experimental Mode Isolation

10 The experimental technique to achieve single-mode isolation is often referred to as *normal-mode force appropriation* 11 (or phase resonance testing) [9,36], in which the so-called local phase quadrature criterion is widely adopted for lightly-12 damped structures [12]. This technique is also used in the proposed test strategy and is briefly revisited.

13 Ideally, a NNM is appropriated when the external force cancels all the internal damping of the test structure [9-13, 14 27], i.e.

15 $\mathbf{C}\vec{u} + \mathbf{f}_{\text{nl}}^{\text{d}}(\vec{u}) = \mathbf{p}(t), \forall t.$ (11)

16 Eq.(11) represents a condition of *perfect force appropriation* [12], which is not practically feasible due to multiple reasons 17 [9-13, 27]: i) the viscous damping model of the test structure is simply an assumption. In practice, the damping matrix 18 $C \in \mathbb{R}^{N \times N}$ and the internal nonlinear damping force $f_{nl}^d(\vec{u}) \in \mathbb{R}^{N \times 1}$ are <mark>rarely</mark> known *a priori*. ii) A perfect force 19 appropriation denoted by Eq.(11) demands spatially-distributed, multi-harmonic forces $p(t) \in \mathbb{R}^{N \times 1}$ to balance out the 20 internal damping at each DOF of the test structure. It would demand a prohibitively large number of output channels of 21 the vibration controller and inevitably result in excessive structure-shaker interactions. Fortunately, in case of a lightly-22 damped structure and the absence of internal resonance, a single-harmonic appropriated force is sufficient to isolate a 23 NNM with satisfactory accuracy [9], which is known as an *imperfect force appropriation* technique [12]. In this technique,

1 an imperfect appropriated force is applied to a single point of the structure [9-12] or at its base [13], with the applied force

- 2 being tuned in quadrature (a phase lag of 90°) with respect to the fundamental displacement/acceleration response. The
- 3 90° phase lag is referred to as the *local phase quadrature criterion* [12].

4 The proposed strategy considers applying an imperfect appropriated force - a single-point, single-harmonic force - 5 to the test structure: single point of the structure [9-12] or at its base [13], with the applied force
with respect to the fundamental displacement/acceleration response. The
 yuadrature criterion [12],
 an imperfect appropriated force - a

$$
\mathbf{p}(t) = \text{Re}\left(\mathbf{I}_k \, p_{\text{app}} e^{j\tilde{\omega}_r t}\right),\tag{12}
$$

7 where l_k is the k-th vector, indicating the location of the applied force and p_{app} denotes its magnitude.

8 The structural response of an arbitrary s-th coordinate can be denoted as:

$$
u_{s}(t) \approx \operatorname{Re}\left(\sum_{n=0}^{N_{h}}\tilde{\psi}_{rs}^{(n)}e^{jn\tilde{\omega}_{r}t}\right) = \operatorname{Re}\left(\sum_{n=0}^{N_{h}}\tilde{I}_{s}^{\top}\tilde{\phi}_{r}^{(n)}q_{r}e^{jn\tilde{\omega}_{r}t}\right),\tag{13}
$$

10 where $\psi_{rs}^{(n)}$ denotes the amplitude of responses at resonance, \mathbf{l}_s is the s-th unit vector. Many papers choose the original 11 point (i.e., $s=k$) to formulate the local phase quadrature criterion [9-17], while in this paper, it is generalised to an arbitrary 12 point represented by the s-th coordinate (u_s) . The driving frequency that achieves NNM isolation $(\tilde{\omega}_r)$ is directly taken 13 as the nonlinear modal frequency.

14 Although the use of an imperfect appropriated force is generally 'believed' to be sufficient to isolate a NNM [9], a 15 posteriori check of the actual quality of the appropriation should be performed by using experimentally measured data 16 [9,19]. In a full-field test setting, the authors recommend using indicators such as the average response function, average 17 force function, and a full-field phase-lag map [19] to evaluate the quality of NNM isolation.

18 **D. Extract Nonlinear Modal Parameters**

- 19 The proposed strategy estimates the nonlinear modal parameters from phase resonance and phase separation tests.
- 20 The derivations of nonlinear modal frequency, modal damping ratio, and mode shapes are now detailed.

1 **i.** Nonlinear modal frequency

2 Backbone curves are used to describe the amplitude-dependent modal frequencies of a nonlinear structure. In the 3 literature, there are two definitions of backbone curves that are experimental observable [37]. The first is the amplitude 4 resonance definition used by Nayfeh [38], where a backbone is taken as a curve of maximal periodic response amplitude 5 as a function of its corresponding driving frequency. The second definition, which is the one adopted in the proposed 6 strategy, is based on the concept of phase resonance. In this definition, a backbone curve is treated as the frequency-7 response relationship of the unforced limit of an undamped nonlinear system [38,39]. More specifically, this backbone is 8 experimentally approximated by a curve depicting the magnitude of the fundamental harmonic response $\tilde{\psi}_{rs}^{(1)}$ as a 9 function of the driving frequency $(\tilde{\omega}_r)$ of the appropriated force. The phase lag between the fundamental harmonic of the 10 displacement/acceleration responses and the driving force along the backbone curve must be controlled as close as 11 possible to 90° in the test.

12 **ii.** Nonlinear modal damping ratio

13 Extracting the nonlinear damping ratio has always been challenging in dynamic testing. In a nonlinear phase 14 resonance test setting, researchers have proposed using the excitation power quantity [11-13], which involves calculations 15 of active power and mass-normalised modal shapes. Herein, an alternative approach that does not involve power quantity 16 calculations is derived for the proposed strategy.

17 The proposed approach first takes advantage of the mature and robust experimental modal analysis techniques to 18 estimate modal parameters of the underlying linear system of the test structure. This is achieved by performing 19 conventional phase separation testing techniques. Specifically, linear FRFs in the vicinity of the r-th mode are measured 20 by exciting the system with very low amplitude excitations in order to avoid activating nonlinear dynamics. Subsequently, 21 the natural frequency $\hat{\omega}_r$ and modal damping ratio $\hat{\zeta}_r$ of the underlying linear system are obtained using curve-fitting 22 methods or the half-power bandwidth method [40]. In this regard, the underlying linear modal parameters also satisfy Eq. 23 (9), i.e.

$$
2j\hat{m}_r\hat{\omega}_r^2\hat{\zeta}_r\hat{q}_r = \hat{\psi}_{rk}\hat{p}_{lin},\qquad(14)
$$

2 where the underlying linear modal parameters are denoted using the notion $\hat{\bullet}$. The modal damping ratio is $\hat{\zeta}_r = \hat{c}_r/2\hat{m}_r\hat{\omega}_r$, and $\hat{\psi}_{rk} = \hat{I}_k^{\dagger}\hat{\psi}_r$. \hat{p}_{lin} is the magnitude of the external force used to excite the system during the linear 4 experimental modal analysis.

5 Next, the proposed strategy estimates the NNM damping ratios using the response data along the backbone curves. 6 Considering the phase resonance condition of r-th NNM and defining an analogous expression of nonlinear damping ratio $\tilde{\zeta}_r = \tilde{c}_r/2\tilde{m}_r\tilde{\omega}_r$, the imaginary part of Eq. (9) that describes the **backbone curve of fundamental responses** becomes:

$$
2j\tilde{m}_r\tilde{\omega}_r^2\tilde{\zeta}_r\tilde{q}_r = \tilde{\psi}_{rk}^{(1)}\tilde{p}_{\text{app}r},\tag{15}
$$

9 where $\tilde{\psi}_{rk}^{(1)} = \mathbf{I}_k^{\mathrm{T}} \tilde{\psi}_r^{(1)}$. It indicates that the imperfect appropriated force balances the equivalent modal viscous damping 10 forces when projected to the r-th NNM coordinate. It is shown that mass-normalisation of the mode shapes is not strictly 11 required at this step. Note also that the derived Eq. (15) in this paper is essentially equivalent to balancing the excitation 12 power with the dissipative power if both sides of the equation are multiplied by the velocity term [11,12].

13 Comparing Eq. (15) to Eq. (14), and introducing a set of non-dimensional numbers $\overline{\zeta}_r = \overline{\zeta}_r / \hat{\zeta}_r$, $\overline{\psi}_{rk} = \overline{\psi}_{rk}^{(1)} / \hat{\psi}_{rk}$, 14 $\bar{p}_{\text{appr}} = \tilde{p}_{\text{appr}} / \hat{p}_{\text{lin}}$, $\bar{m}_r = \tilde{m}_r / \hat{m}_r$, $\bar{\omega}_r = \tilde{\omega}_r / \hat{\omega}_r$, $\bar{q}_r = \tilde{q}_r / \hat{q}_r$ denoted by the notion $\bar{\bullet}$, it leads to the expression of non-15 dimensional damping ratio:

$$
\overline{\zeta}_r = \overline{\psi}_{rk} \, \overline{p}_{\text{appr}} / \overline{m}_r \overline{\omega}_r^2 \overline{q}_r \; . \tag{16}
$$

17 Eq. (16) clearly shows that the nonlinear damping ratio is linked to the underlying linear damping ratio and other modal 18 parameters. To extract nonlinear damping using Eq. (16), further assumptions of the nonlinear mode shapes are made: 19 Scenario 1: The fundamental mode shape of a NNM is dependent on vibration amplitudes. In case the fundamental 20 mode shape of a NNM changes significantly with the vibration amplitudes, it is necessary to measure a set of points, 21 including the driving point (k-th coordinate) and several other points distributed across the surface of the test structure. 22 These points allow us to quantify the changes in vibration shapes. The coordinates of these measured points are then 1 denoted as $s = \{k, s_1, s_2, \dots s_{exp}\}\$. To estimate the mass matrix of the test structure, the underlying linear mode shapes are 2 used [12,35]: , $s_2, \dots s_{\infty}$. To estimate the mass matrix of the test structure, the underlying linear mode shapes are
 $\mathbf{M}_{\infty} = (\hat{\boldsymbol{\phi}}^T)^+ \mathbf{I}(\hat{\boldsymbol{\phi}})^+$, (17)

d for the normalisation of the nonlinear mode shapes [12,35]:
 f the test structure, the underlying linear mode shapes are
 $(\hat{\phi}_i^T)^{\dagger} I(\hat{\phi}_i)^{\dagger}$, (17)

ode shapes [12,35]:
 $\int_0^T M_{\text{exp}} \tilde{\phi}_i^{(1)} = I.$ (18)

amental harmonic - $\tilde{\phi}_i^{(1)}$ - in Eq. (18).

$$
\mathbf{M}_{\text{exp}} = \left(\hat{\boldsymbol{\phi}}_{r}^{\text{T}}\right)^{+} \mathbf{I}\left(\hat{\boldsymbol{\phi}}_{r}^{\text{T}}\right)^{+},\tag{17}
$$

4 which can then be used for the normalisation of the nonlinear mode shapes [12,35]:

$$
\left(\tilde{\boldsymbol{\phi}}_{r}^{(1)}\right)^{\mathrm{T}}\mathbf{M}_{\exp}\tilde{\boldsymbol{\phi}}_{r}^{(1)}=\mathbf{I}.\tag{18}
$$

6 Note that the nonlinear mode shape is normalised using its fundamental harmonic - $\tilde{\phi}^{(1)}$ - in Eq. (18).

7 Recall that the structural response is assumed to be dominated by one NNM, such that:

$$
\overline{\psi}_s \approx \overline{\psi}_{rs} = \overline{\phi}_{rs} \overline{q}_r , \qquad (19)
$$

9 where the non-dimensional numbers $\overline{\psi}_s = \psi_s^{(1)}/\hat{\psi}_s$, $\overline{\phi}_{rs} = \tilde{\phi}_{rs}^{(1)}/\hat{\phi}_{rs}$ are defined similarly as those shown in Eq. (16). 10 Inserting Eq. (19) into Eq. (16), the nonlinear modal damping ratio can be estimated via the non-dimensional

11 responses of an arbitrary point $\overline{\psi}_s$ (denoted by s-th coordinate):

12
$$
\tilde{\zeta}_r \approx \frac{\overline{\phi}_{rk}\overline{\phi}_{rs}\overline{p}_{appr}}{\overline{\omega}_r^2 \overline{\psi}_s} \hat{\zeta}_r, s = k, s_1, s_2, \cdots s_{exp}
$$
(20)

13 For example, using the driving-point data, one obtains: $\tilde{\zeta}_r \approx (\overline{\phi}_r^2 \overline{p}_{appr}/\overline{\phi}_r^2 \overline{\psi}_k)\hat{\zeta}_r$. Note that the underlying linear 14 damping ratio $\hat{\zeta}_r$ has already been estimated using the established experimental modal analysis techniques.

15 Scenario 2: The fundamental mode shape of a NNM is independent on vibration **amplitudes.** For a wide range of 16 industrial structures such as turbine blades [13] or jointed structures [41], the fundamental mode shape of a NNM may 17 remain unchanged with increasing vibration amplitudes despite substantial deviations of modal frequencies and damping 18 ratios occur. These behaviours are often observed for structures that do not experience strong nonlinear modal interactions. 19 In such cases, the nonlinear modal damping ratios can be extracted in a much simpler way.

- 20 Using the assumption that the fundamental nonlinear mode shape does not change with vibration amplitudes, mass-
- 21 normalisation of the mode shapes becomes unnecessary since the non-dimensional numbers satisfy $\overline{\phi}_{rk} \approx 1, \overline{\phi}_{rs} \approx 1, \overline{m}_r \approx 1$.

22 Substituting these approximations into Eq. (16), one obtains:

$$
\tilde{\zeta}_r \approx \frac{\overline{p}_{\text{appr}}}{\overline{\omega}_r^2 \overline{\psi}_s} \hat{\zeta}_r,\tag{21}
$$

2 where the non-dimensional values of the appropriated force \bar{p}_{appr} , appropriated forcing frequency $\bar{\omega}_r$, and the resonant 3 response magnitude $\bar{\psi}_s$ can be obtained directly from the backbone curve. Eq. (21) is quite useful for extracting modal 4 damping ratios along the backbone curve by using the response of an arbitrary point (denoted as the s-th coordinate). 5 Therefore, one measuring point with a larger vibration amplitude and a better signal-to-noise ratio can be chosen in this 6 regard.

7 ⅲ. Full-field mode shapes

8 The full-field mode shapes are experimentally approximated by sinusoidal Operating Deflection Shapes (ODSs) at 9 the phase resonance of the NNM. To allow this approximation, three conditions must be met [42]: 1) the excitation force 10 should not be applied to nodal DOFs of the NNM, 2) the phase resonance condition must be met with sufficient accuracy, 11 and 3) only one NNM should dominate the vibration of the test structure. 12 In the proposed nonlinear modal testing strategy, the full-field, multi-harmonic ODSs $-\tilde{\psi}_r^{(n)}(n=1 \cdots N_h)$ - are 13 obtained by performing a series of sine-dwell tests, in which the driving force dwells at few discrete frequencies along

14 the backbone curve for a certain duration while the 3D SLDV measures the corresponding full-field vibrations. To reduce 15 testing time, a super-short sampling interval is used for each scan point, resulting in a coarse frequency resolution and 16 severe spectral leakages in the response spectra, as expected. A multi-step Interpolated-FFT algorithm proposed by the 17 authors [18,19] is therefore recommended to refine the frequency resolution and reduce energy leakages. the corresponding full-field vibrations. To reduce

the corresponding in a coarse frequency resolution and

ep Interpolated-FFT algorithm proposed by the

ion and reduce energy leakages.

18 E. Synthesis of Near-resonant Frequency Responses

19 Under the assumption of single-NNM motion expressed by Eq. (9), the nonlinear modal parameters can be used to 20 synthesise the near-resonant forced responses. This is achieved by expressing the driving frequency as a function of the 21 magnitudes of the appropriated force [1,2, 13], i.e.

$$
\Omega_{\pm}^2 = \Gamma_{\omega} \pm \sqrt{\Gamma_{\omega}^2 - \tilde{\omega}_r^4 + \tilde{\alpha}^2 \left(\tilde{p}_{\text{appr}} / \tilde{\psi}_s^{(1)}\right)^2},\tag{22}
$$

1 where $\Gamma_{\omega} = \tilde{\omega}_r^2 - 2 \tilde{\zeta}_r^2 \tilde{\omega}_r^2$, and $\tilde{\alpha} = \tilde{\phi}_{rk}^{(1)} \tilde{\phi}_{rs}^{(1)} / \tilde{m}_r$. $\tilde{\psi}_s^{(1)}$ denotes the fundamental responses of the s-th coordinate.

2 Substituting the nonlinear modal parameters into Eq. (22), the driving frequencies Ω can be resolved for given 3 response amplitudes, thereby obtaining the nonlinear responses explicitly [43,44]. In the case of NNM mode shape that 4 is independent of vibration **amplitudes**, $\tilde{\alpha}$ can be approximated by its underlying linear value without mass-5 normalisation, i.e.

$$
\tilde{\alpha} \approx \hat{\alpha} = 2\tilde{\zeta}_r \hat{\omega}_r^2 \hat{\psi}_s / \hat{p}_{\text{lin}}.
$$
\n(23)

7 Eq. (22) is often used to validate the accuracy of the extracted nonlinear modal parameters by comparing its synthesised 8 frequency responses to the directly measured ones [2]. Note that the synthesis could be extended to include multi-9 harmonic terms of the resonant mode and contributions of the off-resonant modes if necessary [34].

10 Ⅲ. Full-field measurement strategy

11 A. Test Setup

12 Figure 1 illustrates the proposed test setup for full-field measurement of lightweight nonlinear structures. It combines 13 a 3D SLDV with a MISO vibration controller. The controller applies phase separation and phase resonance testing 14 techniques to the structure, while the 3D SLDV carries out full-field measurements when the controller reaches a steady 15 state. The 3D SLDV measures three-dimensional vibration responses of a scan point at a sampling rate that should be at 16 least twice the highest constituent harmonic of interest. Figure 1 shows that the two systems are synchronised via the 17 excitation force signal applied to the structure. This signal is simultaneously sampled by the MISO vibration controller 18 (for the purpose of closed-loop control) and the 3D SLDV (as a reference). An accelerometer is attached to the tip of the 19 test structure for closed-loop control, and its signal is used to define a vibration limit to ensure structure safety.

2 Figure 1. Proposed test setup for full-field measurement of lightweight structures.

3 B. Proposed Test Strategy

4 Figure 2 depicts a flow chart that outlines three main phases of the proposed full-field nonlinear modal testing 5 strategy. Phase I involves applying low-amplitude excitations to the test structure and conducting conventional linear 6 modal testing to estimate the underlying linear modal parameters. In Phase Ⅱ, the lack of homogeneity of FRFs is used to 7 detect NNMs first, followed by performing nonlinear modal testing for each detected NNM. To reduce the overall testing 8 time, phase separation and phase resonance testing techniques are integrated in this phase. The measured nonlinear modal 9 parameters are also validated at the end of Phase II. Finally, in Phase III, the test structure undergoes an integrity check. 10 A few key details are highlighted as follows:

11 Phase I applies conventional full-field linear modal testing techniques to the structure and obtains modal parameters 12 of its underlying linear model [45]. In Step 1, FRFs of a few representative points (avoiding nodal points) are firstly 13 measured using low-amplitude excitations. It is then followed by applying the conventional experimental modal analysis 14 algorithms [40] to the measured FRFs and extracting linear natural frequencies and modal damping ratios within the 15 frequency range of interest. It is worth noting that a relatively long sampling interval for each representative point should 1 be used to allow a fine frequency resolution of the FRFs. This would not take too much time since only a limited number 2 of representative points are measured at this stage. Step 2 utilises the identified linear natural frequencies and measures 3 linear resonant operating deflection shapes (ODSs) using the so-called 'Fast-Scan' mode of the 3D SLDV [46]. This 4 manner allows measurement of the responses at a speed of up to 50 scan points per second.

5 During Phase II, the full-field nonlinear modal testing is carried out. It starts with Step 3 of exciting the test structure 6 with a slowly swept-sine force at a much higher input level than the initial linear response measurements to trigger 7 nonlinear dynamic behaviours. Then, simple indices such as resonance frequency shifting can be used to ascertain the 8 modes containing non-trivial nonlinearity; this step is frequently referred to as the 'detection' of NNMs in the literature 9 [45,47,48]. It is followed by Step 4, in which a fast nonlinear phase resonance test is performed to trace out the backbone 10 curve of a NNM using low to high input levels. During this step, dedicated forcing signals generated by PLL controllers 11 [11-13], CBC methods [14-17], or resonance tracking techniques [18,19] can be adopted. Additionally, only a few 12 representative points are measured to reduce testing time. Using the test data gathered in Step 4, the nonlinear modal 13 frequencies and damping ratios are estimated along the backbone curve. Step 5 then applies the nonlinear phase resonance 14 testing technique to the test structure but only dwells at a few forcing levels for a period of time (sine-dwell testing), while 15 the 3D SLDV is used to measure the full-field responses of the vibrating structure. To reduce testing time, a super-short 16 sampling interval is used for each scan point. Thereafter, the Multi-step Interpolated FFT algorithm [19] is applied to the 17 measured spectra to refine the frequency resolutions and remove the unwanted energy leakages, obtaining multi-harmonic 18 full-field ODSs with improved accuracy. As shown in Figure 2, Phase Ⅱ ends up with Step 6 of validation. In this step, 19 mini-sweeps around the NNMs are performed, and the near-resonant frequency responses at a few high-amplitude forcing 20 levels are measured. These directly measured frequency responses are reserved for validating the extracted modal 21 parameters of NNMs. It is important to note that Steps 4 to 6 should be applied to each detected NNM of the test structure 22 sequentially until all the NNMs are measured.

- 1 Phase III performs a final check of the test structure by applying the same low-**amplitude** excitation as Phase I. The
- 2 resulting FRFs are then compared to those obtained during Phase Ⅰ. This ensures that the test structure does not have
- 3 noticeable changes in dynamics after the high-amplitude test campaign.

4

5 Figure 2. The proposed full-field measurement strategy for lightweight nonlinear structures.

6 Ⅳ. Application to an aero-engine fan blade

7 The proposed test strategy is explained in detail in this section, using a realistic, full-scale fan blade as an example. 8 As shown in Figure 3, the investigated fan blade was clamped at the root. At the back side of the blade, a single-point 9 input force was applied near the root of the blade by a Data Physics Signal Force V4 shaker. The shaker was controlled 10 by a MISO vibration controller (Data Physics SignalStar ABACUS Vector). The applied force was measured via a PCB 11 208C02 transducer, and the response of the blade tip (also referred to as a monitoring point) was measured by a triaxial 12 accelerometer (PCB 356A03). The 3D SLDV used for the test was a Polytec PSV-500-3D-HV Scanning Laser Doppler 1 Vibrometer. Figure 3 also illustrates the dense measurement grid defined on the blade's front surface. It consists of as 2 many as 2016 scan points. The test setup was initially prepared for a technology demonstration, which could be further 3 improved in many aspects: 1) use a non-contact magnetic shaker to replace the Data Physics Signal Force V4 shaker, or 4 2) adopt a laser Doppler vibrometer (LDV) instead of the attached accelerometer to measure the blade's tip responses. 5 However, these improvements are beyond the scope of this paper. Note also that the test results of the fan blade are 6 normalised for commercial confidentiality reasons.

7

8 Figure 3. A picture of the fan blade test setup, in which the white dots represent scan points.

9 A. Phase Ⅰ: Full-field Linear Modal Testing

10 In Phase I, A conventional full-field linear modal test was conducted first to estimate the underlying linear modal 11 parameters of the test structure. This phase involves two steps: the first step is to identify natural frequencies and damping 12 ratios, and the second step is to measure full-field mode shapes.

13 In Step 1, to obtain the underlying linear natural frequencies and damping ratios of the blade, an open-loop, low-

- 14 amplitude random signal was used to drive the shaker and the Single-Shot measurement mode of 3D SLDV was employed
- 15 to measure FRFs of three representative points TipLeft, TipMiddle, and TipRight, as shown in Figure 4. The FRFs were
- 16 measured at a sampling frequency of 2.5 kHz, and 102400 spectral lines were set in the frequency range of 0-1000 Hz,

1 providing a very fine frequency resolution of 9.77 mHz. Figure 5 depicts the measured FRF curves of the representative 2 points, with each curve being estimated using five peak-hold averages to mitigate the noise effect. To verify if the low-3 amplitude forcing excites linear responses, a slightly higher-level random force was applied to the structure and the FRFs 4 were measured again. A comparison between the initial and the second test results shows no recognisable variations in 5 the measured FRF, affirming that the initial measured dynamics can be considered linear. Consequently, the initial FRFs 6 of the representative points in the x- and y- directions, as plotted in Figure 3, were used to extract the underlying linear 7 modal parameters of the blade. Note that the z-directional (axial direction of the fan blade) responses were too small and 8 hence excluded in the modal analysis.

9 Figure 6 shows the stabilisation diagram obtained by applying the least-squares rational function estimation method 10 [49] to the measured linear FRFs. The stable criterion is set to 0.5% for the frequency and 1% for the damping ratio. In 11 the diagram, the fitting model order is set to 18, and 14 stable modes are observed within the frequency range of interest. 12 Table 1 lists the identified linear natural frequencies and modal damping ratios. Note that all presented values are 13 normalised using the first modal parameters, as required by our industry partner.

16

3 Figure 5. Measured mobility FRFs of the representative points using low-amplitude random excitations.

6 Figure 6. Stabilisation diagram of the fan blade.

Mode order		2	3	$\overline{4}$	5	6	7
Normalised natural		2.494	7.023	8.375	14.594	17.738	19.815
frequency							
Normalised modal		0.6	0.75	0.45	0.75	0.15	0.15
damping ratio							
Mode order	8	9	10	11	12	13	14
Normalised natural	24.275	26.352	30.703	33.672	34.283	37.584	39.339
frequency							
Normalised modal	0.45	0.23	0.87	0.30	0.18	1.00	0.20
damping ratio							

1 Table 1. Identified underlying linear modal parameters of the fan blade.

2 In Step 2, the linear mode shapes are experimentally approximated by the sinusoidal ODSs at resonance [42]. In this 3 regard, the forcing frequency was set to each identified natural frequency (listed in Table 1), and the 3D SLDV was then 4 switched to the Fast-Scan mode [46] to measure full-field linear ODSs. All of the 14 modes in the frequency range of 5 interest were measured, with each measurement taking approximately 1 - 3 minutes. Six of the linear mode shapes with 6 contour lines highlighting the vibration magnitudes are shown in Figure 7; these figures are directly provided by the 7 Polytech Scan Viewer.

3 Figure 7. Six representative linear ODSs at the resonances of (a) Mode 1, (b) Mode 6, (c) Mode 8, (d) Mode 9, (e) 4 Mode 12 and (d) Mode 14, respectively.

5 It is clearly shown in Figure 7 that the higher-order mode shapes are highly curved in three dimensions, with many 6 edge-wise localised vibration patterns. This highlights the complex nature of mode shapes in industrial structures and 7 demonstrates the high quality of full-field measurements using 3D SLDV. The underlying linear natural frequencies, 8 damping ratios and full-field mode shapes of the fan blade have been quantified within the prescribed frequency range. 9 The next phase would be to commence the nonlinear measurement campaign.

10 B. Phase II: Full-field Nonlinear Modal Testing

1

2

11 During Phase II, Step 3 involves applying representative **amplitudes** of excitations that the structure is likely to 12 experience in service [45]. Thereby, a much higher-amplitude excitation was applied to the fan blade, and the blade tip 13 FRFs were measured. To detect NNMs, the FRFs are compared to those measured during Phase I using low-amplitude 14 excitations. If there are any distortions of the peaks or a lack of homogeneity of FRFs, it would be an intuitive indication 15 of nonlinearities [45,47,48].

6 Figure 8. Comparison of the blade's tip accelerance using low- and high-amplitude excitations for (a) Mode 5, (b) Mode 7 8, (c) Mode 10, and (d) Mode 12.

8 Figure 8 presents zoom-in views of the blade tip accelerances for four representative modes of interest. Mode 5 9 shows a strong softening trend in stiffness and lower damping with increased excitation levels. Similarly, Mode 10 also 10 demonstrates a stiffness softening phenomenon, but the resonance peak magnitude seems unchanged. For Modes 8 and 11 12, the FRF discrepancies are trivial, thus allowing them to be treated as linear modes. Here, it should be mentioned again 12 that the thresholds of frequency shift or change of FRF resonant magnitudes for a mode to be deemed as NNM are 1 dependent on individual industrial requirements. In this case, Modes 5 and 10 are considered NNMs, denoted as NNM 5 2 and NNM 10, and further investigated in the test campaign. No additional tests were conducted for Modes 8 and 12. 3 Next, the backbone curves of NNM 5 and NNM 10 were traced out in Step 4 using fast nonlinear phase resonance 4 testing. In the test, the input force was controlled using a resonance tracking module provided by the Data Physics 5 ABACUS controller, while the responses were measured by the attached monitoring accelerometer at the blade's tip. The 6 resonance tracking module started with a low **amplitude** of excitation and searched for a phase resonance with user-7 defined accuracy of phase-lag quadrature criterion (1° was used for the fan blade). Once the resonance was reached and 8 the data recorded, the controller automatically increased the driving force to the next pre-defined level. Using this step-

9 wise tracking method, the entire branch of the NNM backbone curve was traced out from the low to the highest excitation

11 Figure 9 depicts the measured backbone curves of NNM 5 and NNM 10, respectively. It is shown that both curves 12 lean towards lower frequencies as the vibration levels increased, which confirmed again that these are two modes of 13 softening type. The starting points of the NNM backbone curves are offset from the underlying linear natural frequencies 14 for both modes (estimated in Step 1). This indicates that weak nonlinearities are already present even using the lowest-15 amplitude sinusoidal input in $\frac{a}{a}$ phase resonance test.

1 Figure 9. Measured backbone curves of (a) NNM 5 and (b) NNM 10, while each dot represents a step in the fast nonlinear 2 phase resonance test. The squares highlight the modal frequencies of the underlying linear models measured in Step 1. 3 The response magnitudes are normalised using the peak amplitudes of each mode.

4 Figure 10 shows the nonlinear damping ratios estimated using Eq. (21), where the values are normalised using the 5 corresponding underlying linear values. As can be seen, the damping ratios of the two NNMs vary with vibration levels 6 in different trends. For NNM 5, the starting point of the backbone curve (obtained in Step 4 using the fast nonlinear phase 7 resonance testing) is only 67% compared to the underlying linear modal damping ratio (estimated in Step 1 using phase 8 separation testing). Figure 10(a) also shows that the nonlinear damping ratio of the backbone curve drops rapidly with 9 increased excitation levels and reaches a stable value of only 20% compared to the underlying linear value. In contrast, 10 as shown in Figure 10 (b), the modal damping ratio of NNM 10 remains nearly constant with increased vibration levels. 11 Only a slight fluctuation within 6% is observed. Due to the weak damping nonlinearity, its underlying linear modal 12 damping ratio is also close to the starting point of the backbone curve with less than 1% discrepancy.

15 Figure 10. Estimated modal damping ratios of (a) NNM 5 and (b) NNM 10. The squares highlight the damping ratios of 16 the underlying linear models measured in Step 1. The modal damping ratios are normalised using the corresponding 17 underlying linear damping ratios.

13

18 In the proposed strategy, the nonlinear mode shapes are experimentally approximated by **sinusoidal** ODSs along the 19 backbone curve. To do this, Step 5 uses the MISO vibration controller to apply the sine-dwell test: the structure vibrates

 (a) (b)

 $\qquad \qquad \textbf{(c)}\qquad \qquad \textbf{(d)}$

1

2

3 Figure 11. Full-field phase lags and phase scatter diagrams of NNM 5 with increasing forcing amplitudes leading to (a) 4 Resonance A, (b) Resonance B, (c) Resonance C, (d) Resonance D, and (e) Resonance E obtained by using the Multi-5 step Interpolated-FFT procedure; (f) shows the underlying linear mode shape of Mode 5.

6 ⅱ. Input forces of scan points

7 During the test, the FFT spectrum of the input force is closely monitored for each scan point. Ideally, it should be a 8 single sharp peak. In practice, the force spectra of all phase quadrature points are averaged to formulate the so-called 9 average force spectrum [19] for a resonance, allowing visualisation of the strength of each harmonic component. Figure 10 12 shows the resulting average force spectra at Resonances A to E of NNM 5. In the figure, the fundamental harmonic 11 component appears as a sharp peak in the spectrum, and the higher-order harmonics are trivial for Resonances A to D but 12 evident for Resonance E. Specifically, Figure 12(e) shows that the third harmonic of Resonance E reaches 19.1% of its 13 fundamental harmonic. This is attributed to shaker-structure interactions as strong nonlinear behaviours occur. 14 Suppression of these interactions would require dedicated modelling and control efforts, which are currently being 15 developed [50,51] but beyond the scope of this paper. It is also shown in Figure 12 that the FFT spectra of input forces 16 only have a coarse frequency resolution of 3.125 Hz, and the magnitude estimates have discrepancies of 1.91%, 17.11%, 17 9.16%, 6.28% and 0.66% for Resonances A to E compared to the values provided by the MISO vibration controller. This 1 is due to spectral leakages in the FFT spectra, which are almost guaranteed to occur when a non-integral number of signal

 $\frac{2}{3}$

cycles are sampled in a super-short interval.

1 Figure 12. Average force spectra at (a) Resonance A, (b) Resonance B, (c) Resonance C, (d) Resonance D, and (e) 2 Resonance E of NNM 5 formulated using 3D SLDV datasets. The magnitudes are normalised using the input force of 3 Resonance A.

4 To suppress spectral leakage and refine frequency resolution, the 3D SLDV datasets are processed with in-house 5 code, allowing the multi-step Interpolated FFT procedure to estimate the true frequencies and magnitudes of harmonics. 6 Figure 13 shows the *improved estimates* of the fundamental harmonic forces, where the magnitudes agree quite well with 7 the corresponding control targets set in the MISO vibration controller. The Root Mean Square (RMS) discrepancies of 8 the input forces are now below 0.2% for all the resonances; this confirmed that the MISO controller achieved excellent 9 force control during the test, and the multi-step Interpolated FFT procedure provides estimations with significantly 10 improved accuracy.

12 Figure 13. The appropriated force of NNM 5, where the fundamental harmonic forces were estimated by applying the

13 multi-step Interpolated-FFT procedure to the 3D SLDV datasets. Each dot in the figure represents a scan point. The forces

14 were normalised using the target forcing level of Resonance A.

15 ⅲ. Full-field multi-harmonic mode shapes

17 the contributions of each harmonic, and the latter visualises the corresponding deformation patterns. Despite substantial

¹⁶ Figure 14 shows the average response spectra [19] and the full-field mode shapes of NNM 5. The former highlights

1 frequency shifting being found for these resonances (see Figure 13), the amplitudes of the higher-order harmonics are 2 trivial compared to the fundamental harmonic for Resonances A to D. For Resonance E. However, the higher-order 3 harmonics were triggered as the structure vibrated in larger amplitudes. At this resonance, clear edge-wise localised 4 patterns of higher-order harmonic shapes are observed (see Figure 14(e)), leading to redistributions of stress concentration 5 areas that differ from the fundamental one. It is also interesting to point out that the deformation patterns of a few higher-6 order harmonics resemble the fundamental component (e.g., Figure 14(a) and(b)), while others do not (e.g., Figure 14(e)). 7 It is shown by this fan blade case that the spatially-detailed, multi-harmonic NNM shapes provided valuable information

(a)

Frequency (Hz)

3 Figure 14. Full-field, multi-harmonic mode shapes at (a) Resonance A, (b) Resonance B, (c) Resonance C, (d)

4 Resonance D and (e) Resonance E of NNM 5.

1 A former paper [19] aimed to investigate the multi-step Interpolated-FFT procedure published the results of NNM 2 10. Herein, this paper only presents the full-field results of NNM 5. Interested readers are referred to Ref [19] for detailed 3 mode shapes of NNM 10.

4 After quantifying the modal parameters of the detected NNM, Step 6 directly measures the frequency responses 5 around the NNMs using multiple input levels of sine-sweeps. At this point, the near-resonant frequency responses of the 6 blade's tip are synthesised based on the extracted modal parameters in Step 5. These synthesised responses are compared 7 to the directly measured ones to validate the extracted modal parameters.

8 For the fan blade case, the changes $\frac{in}{n}$ the fundamental harmonic shape of the NNMs are found to be trivial, such that 9 Eq. (22) is solved to synthesise the forced responses. To allow a fine amplitude resolution, Gaussian Process Regression 10 (GPR) models [52] are fitted to the measured discrete points of NNM backbone curves, as shown in Figure 9 and Figure 11 10. Figure 15 shows the fitting results, where good agreements are observed for the nonlinear modal frequencies and 12 damping ratios. It is also worth mentioning that two subsets of data for NNM 5, separated by a breakpoint, are used to 13 train a piecewise GPR model since one continuous model for this mode always suffers from ill-conditioning.

6 Figure 15. Gaussian Process Regression models of the measured backbone curves: (a) and (b) are modal

7 frequencies of NNM 5 and NNM 10, respectively; (c) and (d) are damping ratios of NNM 5 and NNM 10, respectively. 8 The near-resonant frequency responses were directly measured using six levels of backward sine-sweeps with a 9 speed of -0.2 Hz/s. For each input level, Eq. (22) is explicitly solved [43,44] using the interpolated values $\tilde{\zeta}_r(q_r)$ and 10 $\tilde{\omega}_r(q_r)$ of GPR modes. The predicted forced responses (denoted using '-p') and the measured results (denoted by '-m') 11 are compared in Figure 16.

12

1

2

6 Figure 16. A comparison of near-resonant frequency responses around (a) NNM 5 and (b) NNM 10: the 7 solid lines are directly measured data, and the dots represent synthesised FRF using the NNM GPR models

8 and nominal input forces.

1 Surprisingly, as shown in Figure 16 (a), the frequency responses around NNM 5 have substantial discrepancies 2 between the synthesised curves and the directly measured ones. As much as 25% differences in peak amplitudes are 3 observed despite the overall softening trend being captured well. On the other hand, Figure 16 (b) shows the frequency 4 responses around NNM 10, and reasonably good agreements are achieved for this mode. The reason for these 5 discrepancies is found to be the well-known 'force-drop' phenomenon when measuring frequency responses, in which the 6 input force fluctuates around the 'nominal' levels during sine-sweeps. Figure 17 shows a zoom-in view of the actual 7 measured input forces for NNM 5 and NNM 10, respectively. It is shown that a substantial amount of force drops occur 8 for NNM 5 and result in large errors when using the nominal forcing level to predict the forced responses.

11 Figure 17. Zoom-in view of the measured input forces during sine-sweeps for (a) NNM 5 and (b) NNM 10.

12 To address this issue for NNM 5 , a modified synthesis of frequency response curves (denoted using '-mp') using the 13 actual measured input forces (shown in Figure 17) is conducted. Figure 18 compares the modified synthesised results to 14 the directly measured counterparts around \overline{NNM} 5. It is shown that the modified synthesised curves achieve a much better 15 agreement with the directly measured ones. An additional peak on the left side of the response curves appears in the 16 synthesised curve, which may be attributed to the transient dynamics in the swept-sine testing since backward sweeps are

- 1 used. Overall, the modified synthesised responses reach satisfactory accuracy for multiple input levels, indicating that the
- 2 extracted nonlinear modal parameters are of good quality.

5 Figure 18. A comparison of near-resonant frequency responses around NNM 5, where solid lines are directly measured 6 data, and dotted lines represent modified synthesised curves using measured input forces.

7 C. Phase III: Final Check

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8 At the end of the test campaign, it is crucial to verify that the test structure has not been over-tested or damaged 9 during the high-amplitude nonlinear modal testing. The fan blade was subjected to a low-amplitude excitation, which was 10 the same as that used in Step 1 of Phase I. The measured FRFs are compared in Figure 19. The excellent agreement 11 indicates that there were no damage or recognisable structural changes during the test campaign.

2 Figure 19. A comparison of y-directional FRFs of the TipRight point before and after the test campaign.

3 Ⅴ. Conclusions

1

4 This paper **presents** a full-field measurement strategy for lightweight nonlinear structures using 3D SLDV. The test 5 setup uses a non-contact 3D SLDV in combination with a MISO vibration controller to measure NNM parameters. The 6 proposed test strategy comprises three major phases. In Phase Ⅰ, conventional full-field modal testing is conducted to 7 measure the underlying linear modal parameters of the test structure, allowing the nonlinear modal parameters to be linked 8 to these underlying linear modal parameters using a set of non-dimensional numbers. It offers a convenient way to 9 estimate nonlinear damping ratios with minimal manipulation of experimental data. Phase II detects NNMs and quantifies 10 their backbone curves using fast phase-resonance testing, in which sinusoidal excitations were used to measure the 11 amplitude-dependent natural frequencies and modal damping ratios. Note that even when small amplitudes of excitations 12 were used, the measured results may differ from the underlying linear values estimated in Phase I. Thereafter, the highly 13 detailed, multi-harmonic mode shapes are quantified using sine-dwell testing along each backbone curve. In this step, it 14 is necessary to monitor the phase resonance condition for each scan point and apply strict requirements of the phase lag 15 criterion to identify and reject any outliers among the scan points. Phase II ends with a validation of the extracted NNM 16 parameter by synthesising frequency responses and comparing them to the directly measured ones. Particular attention

4 The test setup and proposed strategy are demonstrated on a realistic, full-scale fan blade featuring complex geometry 5 and softening nonlinear behaviours. Resulting have shown that all three modal parameters - nonlinear modal frequency, 6 nonlinear damping ratio and full-field multi-harmonic mode shape of the two NNMs are quantified with fine frequency 7 and spatial resolutions that meet stringent industry standards. The critical steps for making this strategy time-efficient 8 while maintaining the frequency resolution and data accuracy are twofold: 1) a proper combination of phase separation 9 and phase resonance techniques; 2) the use of super-short time intervals for each scan point in a full-field test setting. 10 Unique advantages of the proposed measurement strategy include a high sampling rate (12.5 kHz used in this paper), a 11 fine displacement resolution, and a fine frequency resolution, making it suitable for the full-field measurement of 12 industrial-scale structures.

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