Defect detection in FRP-bonded structural system via phase-based motion magnification technique

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Summary
Fiber-reinforced polymer (FRP)-bonded structural systems have been increasingly used in the field of civil infrastructure. Despite the outstanding advances in the applications of these structures, the interfacial defect between FRP composite and basis material occurs frequently during the designed service life. This type of defect can severely reduce the system integrity, which requires appropriate methods for defect detection in order to control the structural health state. This paper presents a novel approach of using phase-based motion magnification technique for detection of interfacial defect in FRP-bonded structural system. The research demonstrates that this video processing technique can effectively amplify the small surface motion at the defect location of FRP-bonded panel exposed to an air blow. The defect location and shape can be distinguished from the surrounding intact region, given that the two important parameters of bandpass frequency range and motion amplification factor are appropriately selected. Based on the research findings, a suitable defect detection scheme towards the FRP-bonded structural systems via this computational technique is established. The offered methodology does not require sensor installation and wiring, which enables an inexpensive and practical way for structural assessment.

KEYWORDS
computational technique, defect detection, fiber-reinforced polymer-bonded structural system, structural health assessment, system identification

1 | INTRODUCTION

Fiber-reinforced polymer (FRP) material features its high specific stiffness and strength, good fatigue performance, and damage tolerance, which can effectively improve the flexural and shear capacity of engineering structures.¹⁻⁴ In construction and building technology, this composite has been widely used to strengthen the existing deficient concrete structures. Also, it can promote the wide utilization of wood materials in buildings due to the following two important benefits: (a) enhancing the load-carrying capacity of wood structural elements (e.g., beam and column) by bonding FRP and (b) saving the construction energy as wood is a renewable and green building material in comparison to cement, concrete, and steel.²⁻⁸ Nevertheless, FRP-bonded structural system suffers from interface deterioration and defect initiation due to outside instant impact or environmental attacks. The deterioration of FRP-bonded wood structure can be more serious because the wood component is susceptible to chemical degradation, fungal infection, and entry of pathogens and insects.⁹⁻¹³ Hence, the interfacial defect between the FRP and the substrate frequently occurs.
In this circumstance, the strengthening efficiency by using FRP composite is reduced. With the increasing use of FRP-bonded structural system in the field of civil engineering infrastructure, suitable and accurate detection of the bonding condition between the FRP and the basis material is important for maintaining the structural performance.

Currently, many remarkable technologies have been investigated or employed in defect detection of FRP-bonded composite beams, plates, and columns. Most of the methods rely on detecting the mechanical wave propagated through the composite material or electromagnetic signal reflected from the target. Mechanical wave-based techniques (e.g., acoustic emission technique, photophone-based approach, and ultrasonic technique) have received considerable attentions for damage evaluation of bonded structural system. Besides, electromagnetic wave-based techniques (e.g., radar technology, infrared thermography, impedance measurement, and laser reflection technique) have been used to evaluate deterioration of FRP-bonded structural system with great success. More recently, acoustic-laser technique that combines the use of mechanical wave (white noise) and electromagnetic wave (laser) has been developed to detect the presence of defect in FRP-bonded plates and columns. Although the above methods have the ability to identify the defect in composite systems, the direct structural response cannot be obtained as the received raw data are often required to be interpreted. Besides, more sophisticated equipment and devices, more specialized data posttreatment, and probably much higher costs are demanded in these techniques. Moreover, noise component is often included in the received signals, which affects the inspection accuracy. In order to detect the defect in FRP-bonded structural system in a more direct and reliable manner, defect visualization becomes interesting and valuable.

As to interfacial defect in FRP-bonded structural system, the defect visualization can probably be realized by surface vibration. With the presence of near-surface defect in FRP-bonded structural system, the surface vibration behavior at the defect region varies from the intact region when an external mechanical excitation is applied. Among the mechanical excitation ways like using air suction cup and direct mechanical loading, the utilization of instant air blow is regarded to be contactless, convenient, and efficient for initiating the structural vibration. When this air blow is applied, the FRP surface vibration at the defect region takes place with its natural frequency (usually from hundreds to thousands). However, such rapid vibration phenomenon is hard to be well observed by naked eye. Generally, this issue can be addressed by adopting the high-speed camera that can record the fast motion and play the medium back in a slow-motion manner. Another issue is that the vibration is too subtle to be perceived due to the high stiffness of FRP plate. With the purpose to solve this problem, video processing methods are encouraged for amplifying the surface motion at the defect region. Thus, the defect location and shape are expected to be visualized from the recorded video. Vision-based technique has been increasingly used in the field of structural health assessment due to its merits of automation, operational convenience, and efficiency. During the past few years, phase-based motion magnification technique has been developed to magnify the motion of target in a video, with the features of low computation cost and good noise handling performance. In this technique, the input video is decomposed by complex-valued steerable pyramids, and the local phase over time at every spatial scale and orientation of a steerable pyramid is computed. Then, the interested phase component is temporally isolated with a bandpass frequency filter, and the bandpassed phase is multiplied by an amplification factor. At the final stage, the magnified phase and the amplitude are reconstructed back into video. Recently, researchers have applied the phase-based motion magnification technique to characterize the vibration behavior and perform the modal analysis of simple structures such as steel cantilever beam and pipe cross section. Considering the excellent performance of video processing, it is motivated to investigate the use of phase-based motion magnification technique in the defect visualization towards FRP-bonded structural system. Compared with the conventional methods based on receiving and analyzing the mechanical and electromagnetic signals, this video processing technique may achieve direct observation of near surface defect from the recorded video. Besides, in this approach, the setup is convenient and the detection is conducted on observing the processed video showing the whole structural surface instead of point-by-point measurement. This can significantly improve the efficiency of defect detection for FRP-bonded structural system.

The objective of this study is to develop an innovative defect detection scheme in FRP-bonded structural system via phase-based motion magnification technique. In the experimental work, FRP-bonded wood panel with interfacial defect is fabricated as the representative of FRP-bonded structural system, because this type of structure is increasingly used and will be commonly applied in construction field. The specimen is subjected to instant air blow, which is recorded by a high-speed camera. Results of defect visualization in video processed by phase-based motion magnification technique are demonstrated. In addition, the two important factors (i.e., bandpass frequency range and motion amplification factor) during the video processing are evaluated to optimize the detection performance. Recommendations of selecting
these two parameters for reliable defect detection are provided. Moreover, future development of this methodology in inspection of FRP-bonded structural system is discussed.

2 | THEORETICAL SECTION

2.1 | Phase-based motion magnification technique

Motion analysis technique from video attracts wide attention in the field of structural engineering. Many researchers in computer vision community have developed algorithms to improve the analysis performance. Calculating the phase gradient of a spatiotemporally bandpass image sequences to obtain the constant phase contours has been studied, which demonstrates an excellent approximation to the real motion.\(^{41,42}\) However, this method requires much optical flow computation. More recently, linear Eulerian video processing has been investigated and used for dampening temporal aliasing of motion in videos and for exhibiting subtle color variations and small motions.\(^{43,44}\) This video processing technique relies on a first-order Taylor approximation to independently process the time series of color values at each pixel, avoiding the need for costly flow computation. Nevertheless, linear Eulerian video processing allows merely small magnification levels at high frequency of spatial domain due to the reliance of first-order Taylor expression.\(^{38}\) In addition, this technique can significantly amplify noise (e.g., ghosting flaws) when the amplification factor is increased.\(^{45}\) To address the above limitations, another phase-based magnification approach for motion processing has been developed in the past several years, which computes the local phase variations for measuring motion in video by Fourier shift theorem. The appeal of phase-based motion magnification is that it avoids explicit optical flow computation and it is significantly less sensitive to noise.\(^{37-39}\) In general, in this technique, the input image sequence (considering the case of a one-dimensional image intensity \(I(x)\)) is decomposed into a multiscale stack by means of Gabor wavelets that are sinusoidal functions modulated by a Gaussian envelope as expressed by Equation (1).

\[
g(x) = e^{\frac{-x^2}{2\sigma^2}} \exp(-iwx), \tag{1}
\]

where \(x\) is the independent spatial variable of the Gabor wavelet, \(w\) is the frequency of the complex sinusoid, and \(\sigma\) is the standard deviation of the Gaussian envelope, modulating the sinusoidal function \(\exp(-iwx)\). Equation (1) has real and imaginary parts\(^{46,47}\):

\[
g(x) = A(x) + iB(x), \tag{2}
\]

\[
A(x) = e^{\frac{-x^2}{2\sigma^2}} \cos(2\pi wx), \tag{3}
\]

\[
B(x) = e^{\frac{-x^2}{2\sigma^2}} \sin(2\pi wx). \tag{4}
\]

When the one-dimensional intensity image \(I(x, t)\) experiences a finite value of motion \(\delta_x\) in the spatial domain, the new image is resulted and expressed by \(I(x + \delta_x, t)\).\(^{48}\) During the image decomposition, the first frame of the one-dimensional image and the second frame image after the motion \(\delta_x\) are convoluted with the complex Gabor filter \(g(x)\).

\[
\tilde{I} = I^*g(x), \tag{5}
\]

where \(\tilde{I}\) refers to image intensity after convolution by Gabor filter. As a result, the convoluted image intensity at two time frames will be mapped to a complex-valued domain called \(\tilde{I}_1(u)\) and \(\tilde{I}_2(u)\), respectively, as expressed by Equations (6) and (7).

\[
\tilde{I}_1(u) = \int_{-\infty}^{+\infty} I(x - u)e^{\frac{-x^2}{2\sigma^2}} e^{(-i2\pi xu)} dx, \tag{6}
\]

\[
\tilde{I}_2(u) = \int_{-\infty}^{+\infty} I(x + \delta_x - u)e^{\frac{-x^2}{2\sigma^2}} e^{(-i2\pi xu)} dx, \tag{7}
\]

where \(\tilde{I}_1(u)\) refers to the convoluted image intensity at Frame 1 and \(\tilde{I}_2(u)\) refers to the convoluted image intensity at Frame 2. By converting the independent variable \(x + \delta_x\) into \(\beta\) in Equation (7), the phase-based motion presentation
for one-dimensional intensity image can be obtained as Equation (8).

\[
\tilde{I}_2(u) = \int_{-\infty}^{\infty} I(\beta - u) e^{-\frac{(\beta - u)^2}{2\sigma^2}} e^{-i2\pi(\beta - \delta_x)} d\beta.
\] (8)

In the above equations, the phase values in the first and second frames of the one-dimensional image intensity can be denoted as \(\varphi_1\) and \(\varphi_2\) expressed by Equations (9) and (10).48

\[
\varphi_1 = \arg[\tilde{I}_1(u)] = 2\pi\beta,
\] (9)

\[
\varphi_2 = \arg[\tilde{I}_2(u)] = 2\pi(\beta - \delta_x).
\] (10)

The phase change \(\Delta\varphi\) between the two consecutive frames can be further derived as

\[
\Delta\varphi = \varphi_1 - \varphi_2 = 2\pi\delta_x.
\] (11)

When amplifying \(\Delta\varphi\) by a factor \(\alpha\), the phase change becomes \(\alpha\Delta\varphi\). Using this value to shift the Fourier coefficients of \(I(x, t)\) can yield \(I(x + (1 + \alpha)\delta_x, t)\).38 The above principle of phase-based motion technique can be extended to two-dimensional spatial functions or images. However, in most real cases, the motion in video cannot be regarded as the global translations of a frame over time but local and complicated spatially varying movement. Hence, the complex steerable pyramid (complex, overcomplete linear transform) is adopted in the phase-based motion technique to break the image into local sinusoids.45 The steerable pyramid is built by applying the Gabor filters to decompose the discrete Fourier transform of an image \(I\) into different spatial frequency subbands simultaneously localized in position, spatial scale, and orientation. Then, the local phase at every spatial scale and orientation of the steerable pyramid is computed. After that, the phases are temporally filtered to isolate the interested motion related to the natural frequency of surface vibration in structure. And then, the bandpass phase in the corresponding frequency range is amplified by a factor. Finally, this magnified phase and the amplitude of the original image are reconstructed back so that the magnified video is rendered. The phase-based motion magnification method has the advantages over the previous Eulerian magnification method in terms of two important perspectives: larger magnification achievement and better noise performance. This method modifies phases instead of amplitudes, without the increase in level of spatial noise. In this research, the phase-based motion magnification was adopted to enlarge the surface vibration at defect region in the FRP-bonded structural system.

### 2.2 Motion amplification factor

From the literature about the phase-based motion magnification,38 the intensity of phase after magnification can be attenuated when Gaussian window of the Gabor filter is applied. Increasing the motion amplification factor may reach the limit where we cannot move the feature because of the limited spatial support of each pyramid filter. Therefore, we need to set the maximum amplification factor such that the amplified motion approximates well the true signal. According to the suggestion of the above literature, the standard deviation of the Gaussian window is used as the bound, which is described by Equation (12).

\[
\alpha\delta(t) < \sigma
\] (12)

where \(\alpha\) is the amplification factor, \(\delta(t)\) is the phase difference, and \(\sigma\) is the standard deviation of Gaussian window. For the half octave pyramid, there are approximately two periods of the sinusoid under the Gaussian envelope of the wavelet. That is,

\[
4\sigma \approx \frac{2}{w_0},
\] (13)

where \(w_0\) is the frequency of the selected filter. This gives Equation (14).

\[
\alpha\delta(t) < \frac{1}{2w_0}.
\] (14)
Exceeding the above limit can cause flaws or blur, as the Gaussian function used for this approach breaks up. Hence, the motion amplification factor is investigated in this study to better apply the video processing technique for visualizing the defect in FRP-bonded structural system.

2.3 | Bandpass frequency range

In addition to the motion amplification factor, selecting the appropriate bandpass frequency range is also needed to be concerned. In phase-based motion magnification technique, the phases are temporally bandpass filtered within a certain frequency range that approximates the motion frequency of a target. With respect to the FRP-bonded structural system with interfacial defect, the FRP surface at the defect region starts to vibrate at its natural frequency after subjecting to an instant air blow. Thus, selecting the appropriate bandpass frequency range that covers the natural frequency of surface vibration at the defect region is critical for achieving satisfactory signal-to-noise level. According to the theory of plate vibration,\(^4^9-5^1\) the natural frequency \(f\) is determined by material properties of FRP and defect area, as expressed by Equations (15), (16), and (17).

\[
DV^4w + \rho h \frac{\partial^2 w}{\partial t^2} = 0, \tag{15}
\]

\[
D = \frac{Eh^3}{12(1 - v^2)}, \tag{16}
\]

\[
f = \frac{\lambda}{a^2} \sqrt{\frac{D}{\rho h}}, \tag{17}
\]

where \(E\) refers to Young’s modulus (GPa), \(h\) refers to thickness of FRP composite (mm), \(v\) refers to Poisson’s ratio of FRP composite, \(w = w(x, y, t)\), representing the transverse displacement of the plate as a function of spatial variables \(x, y\), and time \(t\), \(\rho\) refers to density of FRP plate, and \(\lambda\) refers to the frequency coefficient, which is 35.99 for square plate with four clamped sides. In this paper, importance of selecting the appropriate bandpass frequency range in phase-based motion magnification technique for defect detection of FRP-bonded structural system is demonstrated. Additionally, recommendations of how to choose a good bandpass frequency range are provided.

3 | EXPERIMENTAL WORK

3.1 | Specimen details

In this study, carbon FRP (CFRP)-bonded wood panel was produced as the representative of FRP-bonded structural system. CFRP sheet with thickness of 0.167 mm, Poisson’s ratio of 0.33, density of 1,800 kg/m\(^3\), and Young’s modulus of 50 GPa was prefabricated in the laboratory and then bonded on the top surface of substrate (i.e., wood). Two types of defects, namely, internal air block and interfacial air gap, were respectively made in the CFRP-bonded wood system. On the one hand, to fabricate the FRP-bonded wood panel with an internal air block, two wood plates were prepared with thicknesses of 20 and 40 mm, respectively. A square air hole was made in the central position of wood layer with 20 mm thick. Then, the two wood blocks were bonded by using epoxy resin so that the wood substrate with a surface air hole was fabricated. Afterwards, the prefabricated FRP sheet was bonded to the top surface of wood substrate by epoxy resin. As a result, an internal air block with 20 mm thick underneath the FRP layer was produced to represent the bonding defect caused by wood damage or deterioration. On the other hand, to produce the interfacial air gap in FRP-bonded wood panel, a wood plate with 40 mm thickness was prepared as the substrate. Epoxy resin was applied on the surface of this wood plate except the defect zone. Then, the FRP sheet was bonded to the top surface of epoxy layer so that the interfacial air gap was left underneath the FRP layer. The interfacial defect depth thereby equaled to the thickness of epoxy layer applied on the wood surface. The two types of defect were evaluated by our proposed method, with the purpose to examine whether or not the depth of the superficial defect can influence the effectiveness of defect identification. Besides the type of defect, the number and dimension of defect were varied in CFRP-bonded
wood panel with interfacial air gap. Figure 1 shows the schematic diagram and photograph of the specimens with different defect cases in this research work.

### 3.2 | Experimental setup

The setup of experimental work was consisted of the air blow producer, the high-speed camera, and the tested specimen. Figure 2 depicts the schematic diagram and photograph of experimental setup. An instant air blow was applied towards the FRP-bonded structural panel to initiate the surface vibration of the specimen. The instant air blow was produced by an air gun machine from the laboratory. The incident angle of air blow excitation was 0°. The side view of specimen and its vibration behavior were recorded by a high-speed camera. The resolution of the camera was 800 × 600, and the frame rate was 1,000 frames per second. In addition, the output video frame rate was one per second for the sake of better observation of vibration behavior.

### 3.3 | Video processing

In order to amplify the surface motion of FRP-bonded structural system under instant air blow, phase-based motion magnification technique was used in this study. Normally, this video processing technique involved in four steps. The first one was using the complex steerable pyramid to decompose the video into a series of amplitude and phase images. In this stage, half-octave bandwidth filters were used in the process of video decomposition. Then, the decomposed phases were bandpass filtered. Due to the 1,000 recorded frame rate and the 1 output frame rate, the bandpass frequency range was from 0 to 0.5 Hz according to the Nyquist principle. Because the FRP plate at the defect region vibrates at its natural frequency, the selected bandpass frequency range can have a great influence on the signal-to-noise level in our detection system. Hence, in this research, we compared two bandpass frequency ranges (i.e., 0–0.25 Hz and 0.25–0.50 Hz) to demonstrate the importance of selecting the appropriate bandpass frequency range when applying the phase-based motion magnification in defect detection. In addition to filtered

![FIGURE 1](image-url) Specimen details of fiber-reinforced polymer (FRP)-bonded structural systems under evaluation by phase-based motion magnification: (a) schematic diagram of FRP-bonded wood panel with internal air block and FRP-bonded wood panels with interfacial air gap, and (b) photograph of FRP-bonded wood panels with two defect cases. CFRP: carbon fiber-reinforced polymer
frequency range, the amplification factor is a critical parameter to be considered. Due to the convolution by Gaussian window of the Gabor filters, the amplitude of shifted phase is attenuated. Increasing the motion amplification factor can result in the deviation from the true signal of movement and may reach the limit where we cannot move the feature because of the limited spatial support of each pyramid filter. Therefore, we need to bound the motion amplification factor during video processing so that the magnified signal is noticeable while containing little blur. In this study, after frequency filtering, the phase was magnified by a series of factors from 10 to 5,000. Finally, the magnified phase and amplitude were reconstructed, and the magnified motion video was derived. In this paper, the snapshots of images before and after motion magnification, with different amplification factors and with different bandpass frequency ranges, were presented to demonstrate the effectiveness of defect detection with the aid of phase-based motion magnification technique.

4 | RESULTS AND DISCUSSION

4.1 | Detection performance of phase-based motion magnification technique

Under an air blow excitation, the defect region in FRP-bonded structural system can experience more significant surface displacement than the intact region. Given that the surface of defect region motions at its natural frequency (usually more than several hundred hertz), the high-speed camera is used to record and present the vibration phenomenon so as to make it slow enough for observation. Figure 3a,b shows the images of FRP-bonded wood plate with an internal air block at two time frames before applying the motion magnification technique. Based on the observation, no much displacement variation between the defect region and the intact region can be clearly found. Although the defect region in the image is enlarged in Figure 3a,b, the FRP surface movement is still not obvious. In order to get a clear observation of the surface displacement at the defect region, the phase-based motion magnification technique is performed and the magnified result is illustrated in Figure 3c,d. After applying the motion magnification with amplification factor of 100 and filtered frequency range of 0.25–0.50 Hz, we can find that the surface motion at the defect region is effectively amplified and distinguished from the intact region, as shown in Figure 3c,d. This means that the phase-based motion magnification technique is capable of visualizing the presence of interfacial defect in FRP-bonded structural system shown in the video recorded by high-speed camera.

Besides the FRP-bonded wood panel with internal air block, the FRP-bonded wood panel with interfacial air gap is evaluated by the proposed method to examine whether or not the depth of the superficial defect can affect the effectiveness of defect identification. With the identical setting of motion amplification factor and filtered frequency range, the
FIGURE 3  Images of fiber-reinforced polymer (FRP)-bonded wood panel with internal air block (125 mm × 125 mm) under an instant air blow: Before motion magnification at (a) 0.001 s and (b) 0.002 s and after motion magnification at (c) 0.001 s and (d) 0.002 s. No significant difference of surface motion between the defect region and the intact region is found during the two periods of time, before the use of motion magnification technique. On the contrary, surface displacement at the defect region is much larger than that of intact region when motion magnification technique with amplification factor of 100 and bandpass frequency range of 0.25–0.50 Hz is used.

FIGURE 4  Images after motion magnification for fiber-reinforced polymer (FRP)-bonded wood panel with interfacial air gap (125 mm × 125 mm) under an instant air blow: (a) 0.001 s and (b) 0.002 s. It is found that FRP surface at the defect region with interfacial air gap deforms in a similar pattern to that of defect region with internal air block.
results of motion magnification for FRP-bonded wood panel with an interfacial air gap are depicted in Figure 4. A similar surface deflection for both defect cases is found in Figures 3 and 4, indicating that the depth of the superficial defect has little impact on the effectiveness of characterizing the location and shape of structural surface at debonding defect region.

At this stage, the experiment is carried out with the focus to measure the specimen with one defect, considering that this research work is fundamental and the basis for using the motion magnification method in defect detection. In the detection of multiple defects in real structure, the video processing technique is used to evaluate each defect region separately with appropriate bandpass frequency range and motion amplification factor. When defects are located closely, the boundary condition for each defect region may be changed. For example, the clamped side of a defect region may be converted to simply supported side. As a result, the mode shape and the natural frequency of each vibrating defect region are modified. In order to consider this issue, we fabricated two interfacial defects that were closely existed in FRP-bonded wood panel, as shown in Figure 1a. Vibration excitation is applied on one of defect region as described in Figure 2a. Motion magnification technique is then applied towards this targeted defect region. From Figure 5, it is found that the surface motion near the boundary of defect region seems to be amplified more remarkably as depicted by the red arrows. Due to the presence of adjacent defect region, the vibration mode shape of the targeted defect region can be varied. In this case, we may consider the FRP plate at this defect region as CCCS plate (three clamped sides and one simply supported side) with frequency coefficient of around 31.8. When optimizing the detection performance, the appropriate bandpass frequency range can be selected according to the deflection shape and natural frequency of this vibrating region. Future work will be carried out to investigate the defect detection with more complicated defect arrangement such as two closely located defects with different sizes.

In this study, the high-speed camera with the maximum frame rate of 1,000 was adopted, indicating that it can analyze the structural vibration with natural frequency up to 500 Hz (corresponding Nyquist frequency), according to the Nyquist sampling criterion. Based on the theory of plate vibration, the natural frequency is determined by material properties (e.g., Young’s modulus) of FRP and defect area \( A \), as expressed by Equation (17). Therefore, the smallest detectable dimension \( A_{\text{min}} \) can be expressed by Equation (18) when the natural frequency of 500 Hz is input. Based on the given material properties (e.g., Young’s modulus of 50 GPa) of CFRP in the detection and the camera used in this study, the smallest detectable dimension \( A_{\text{min}} \) is estimated as 120 mm × 120 mm approximately.

\[
A_{\text{min}} = \frac{\lambda}{500} \sqrt{\frac{D}{\rho h}}
\]

To clarify this, our high-speed camera has also been used to detect the smaller defect with dimension of 75 mm × 75 mm (with natural frequency of 1250 Hz), based on the motion magnification technique. The surface motion of defect region cannot be effectively observed after the video processing, as shown in Figure 6. In order to perform an

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**FIGURE 5** Images after motion magnification for fiber-reinforced polymer (FRP)-bonded wood panel with two closely located interfacial air gaps (125 mm × 125 mm) under an instant air blow: (a) 0.001 s and (b) 0.002 s. Surface motion near the boundary of defect region is found to be amplified more remarkably as depicted by the red arrows. Due to the presence of interaction between two defects, the vibration mode shape of the targeted defect region can be changed.
effective detection of the smaller defect with the proposed method, a better high-speed camera with larger frame rate capacity can be used.

In practical measurement, a high-speed camera with larger frame rate is suggested to detect the smaller defect. Table 1 lists the smallest detectable dimension of defect in CFRP-bonded system according to the maximum frame rate of commercially available high-speed camera. It is also noteworthy that if lower Young's modulus of FRP is used in the composite system, the flexural rigidity of defect region and the corresponding smallest detectable dimension will be reduced, as indicated in Equation (18).

Given that the high-speed camera records the side view of FRP-bonded wood structural system, after applying the motion magnification, it is able to quantify the FRP surface displacement value by measuring the movement distance of specimen edge. In order to calculate this FRP surface displacement from the image, the commercial image software Digimizer is adopted. The Digimizer software system uses length of pixels of the image uploaded on the computer, which has been widely adopted by many studies for displacement measurement. In this research, the vibration displacement along with the FRP surface from the bottom to the top is determined. Results are presented in Figure 7. Before motion magnification, the surface displacement is quite small in both defect region and intact region. Also, the variation of surface displacement between defect region and intact region is not considerable. On the contrary, after applying the motion magnification technique, the surface displacement value at the defect region is much larger than that of intact region. The convex shape at the defect region is also clearly found.

### 4.2 | Effect of motion amplification factor on defect detection

Figure 8 compares the FRP-bonded wood panel with internal air block with motion amplification factors of 200 and 5,000 at two time frames and bandpass frequency range of 0.25–0.50 Hz. In Figure 8a,b, it can be found that the surface displacement at the defect region can be identified and blur is rarely found, when the motion amplification factor of 200

### Table 1 | The smallest detectable dimension of defect in CFRP-bonded system with variation of maximum frame rate of commercially available high-speed camera

| Maximum frame rate | Smallest detectable dimension |
|--------------------|------------------------------|
| 1,000              | 120 mm × 120 mm              |
| 2,000              | 84 mm × 84 mm                |
| 5,000              | 53 mm × 53 mm                |
| 10,000             | 37 mm × 37 mm                |
| 25,000             | 24 mm × 24 mm                |

Note. CFRP: carbon fiber-reinforced polymer.
FIGURE 7 Surface displacement of fiber-reinforced polymer-bonded wood panel with internal air block for both defect region and intact region: (a) before motion magnification and (b) after motion magnification. Before motion magnification, the variation of surface displacement between the defect region and the intact region is not considerable, whereas after applying motion magnification, the surface displacement at the defect region is much larger than that of intact region.

FIGURE 8 Images of vibrating fiber-reinforced polymer (FRP)-bonded structural system with different motion amplification factors: amplification factor of 200 at (a) 0.001 s and (b) 0.002 s and amplification factor of 5,000 at (c) 0.001 s and (d) 0.002 s. Image distortion for FRP-bonded wood plate is found when amplification factor of 5,000 is applied. Such high motion amplification factor can reduce the accuracy of defect detection by using this video processing technique.
is used. However, when the motion amplification factor of 5,000 is applied, blurs can be clearly observed, as depicted in Figure 8c,d. This may decline the detection accuracy of defect existed in the structural system. It is indicated that such high motion amplification factor exceeds the limited support of pyramid filter used for video processing. Thus, determining the appropriate amplification factor is essential in the video processing in order to make the magnified motion with high signal-to-noise ratio (SNR).

In view of this concern, we have investigated the surface displacement at the defect center with the motion amplification factor from 0 to 5,000. The results from Figure 9 reveal that the surface displacement is linearly increased when the motion amplification factor is increased from 0 to 100. However, when the amplification factor exceeds 500, this trend is deviated significantly. This can be explained that too large amplification factor \( \alpha \) can cause the Equation (14) invalid. With respect to the FRP-bonded structural system with defect area of 125 mm \( \times \) 125 mm, the amplification factor between 50 and 500 can be considered as the suitable range for defect visualization as it can perform a sensitive motion magnification with little noise. In this paper, methods and procedures for selecting appropriate motion amplification factor for defect detection of FRP-bonded structural system by using phase-based motion magnification technique are recommended in the next section.

4.3 | Effect of bandpass frequency range on defect detection

In this study, the frame rate used in the high-speed camera is 1,000 Hz and the output frame rate in the video is 1 Hz. Given the defect geometry and material properties of FRP at the defect region, the natural frequency of surface vibration is approximately 450 Hz, as calculated by Equation (17). During the defect detection, the instant air pressure was applied at the central position of defect region. After excitation, the free vibration of defect region with its fundamental mode is thought to occur. In this circumstance, the frequency of surface vibration in the video becomes 0.45 Hz. In view of Nyquist frequency principle, the bandpass frequency range that can be handled in the video processing ranges from 0 and 0.5 Hz. In order to demonstrate the effect of bandpass frequency, the motion magnification is conducted with two frequency ranges, 0–0.25 Hz and 0.25–0.50 Hz, whereas the amplification factor is set as 100. From Figure 10, it can be found that the surface displacement magnified by frequency range of 0.25–0.50 Hz is much more significant than that magnified by frequency range of 0–0.25 Hz. More remarkable convex shape of displacement curve for the frequency range of 0.25–0.50 Hz is shown. Because the vibration frequency (0.45 Hz) of FRP surface presented in video falls in the range of 0.25–0.50 Hz, the resonance of surface vibration could be stronger.

In order to better evaluate the motion magnification performance based on the measurement points in Figure 10, the SNR is defined by dividing \( A_d \) (area under the shape curve for defect region) with \( A_i \) (area under the shape curve for intact region), as expressed by Equation (19).
FIGURE 10  Motion magnification with amplification factor of 100 and with two different bandpass frequency ranges: (a) 0–0.25 Hz and (b) 0.25–0.50 Hz. Motion magnification with frequency filter range of 0.25–0.50 Hz results in more significant surface displacement than that with frequency filter range of 0–0.25 Hz. As the natural frequency of surface vibration presented in video is 0.45 Hz and this value falls in the range of 0.25–0.50 Hz, more significant resonant vibration is resulted

\[
SNR = \frac{A_d}{A_t}
\]  

(19)

It is clearly estimated from Figure 10 that SNR level for bandpass frequency range of 0.25–0.50 Hz is higher than that for frequency range of 0–0.25 Hz. This suggests that an appropriate selection of bandpass frequency range can sensitively magnify the structural motion without inducing much unwanted information. In Section 5, recommendation for selecting appropriate bandpass frequency range for defect detection via this technique is discussed.

FIGURE 11  Procedures of selecting the appropriate (a) motion amplification factor and (b) bandpass frequency range in the phase-based motion magnification technique for defect detection of fiber-reinforced polymer-bonded structural system with satisfactory signal-to-noise ratio
4.4 | Discussion on defect detection of FRP-bonded structural system by phase-based motion magnification technique

In this research, the phase-based motion magnification has been demonstrated to be able to detect the interfacial defect in FRP-bonded wood structure. In fact, this video processing technique can be extended to other FRP-bonded structural systems such as FRP-bonded concrete and FRP-bonded steel structures. In addition, the phase-based motion magnification has the ability to evaluate the bonding condition of structures with coatings, such as wall element with thermal coating layer. The main contributions of this study are demonstrating a methodology for defect detection of FRP-bonded structural systems by using computer vision technique that supplements the existing detection techniques in structural inspection. This method has the benefits over the traditional detection techniques towards FRP-bonded structural system in two aspects: (a) defect in structure can be visualized and observed directly in video recorded by high-speed camera, without relying on the complicated interpretation of mechanical and electromagnetic signals, and (b) efficiency of defect detection is substantially improved since that setting up the test scheme is more convenient and detection is performed by watching the structural surface from video rather than taking point-by-point measurement.

5 | RECOMMENDATION AND FUTURE WORK

5.1 | Recommendation of selecting appropriate motion amplification factor in detection

As previously mentioned, increasing the amplification factor can enlarge the surface motion for FRP-bonded structural system. This is the beneficial aspect for defect detection towards the structure because the interfacial defect region can be more easily observed. However, too large motion amplification factor can lead to the reduction in SNR due to the initiation of flaws caused by the limited support of Gaussian window. Here, the suitable amplification factor for video processing can be determined by following the procedures as shown in Figure 11a, which corresponds to the satisfactory SNR. Motion magnification is performed with increasing amplification factors, and the SNRs are calculated accordingly. When the SNR reaches the desirable value, the corresponding amplification factor can be selected in the video processing.

5.2 | Recommendation of selecting appropriate bandpass frequency range in detection

Besides the motion amplification factor, the selection of bandpass frequency range can be conducted by the following steps as shown in Figure 11b. According to the output frame rate, the total bandpass frequency range is determined. Then, the motion magnification is performed with refining the bandpass frequency range, with the purpose to make the frequency range closed to the natural frequency of structural vibration. Similarly, when the SNR reaches the desirable value, the corresponding bandpass frequency range is selected in the video processing.

5.3 | Future work

To further improve this methodology used in detecting FRP-bonded structural system, several research aspects are needed to be considered. In this experiment, the high-speed camera was positioned laterally to clearly capture the mode shape of defect region and measure its surface displacement with the purpose to achieve a more quantitative evaluation. In fact, the proposed technique is able to identify the presence of defect when the camera is positioned in the front of FRP-bonded system to record the in-plane surface of FRP, as demonstrated by our previous conference paper. Because using a single camera can only gain the in-plane motion information, it is difficult to precisely acquire the mode shape and out-of-plane surface displacement of defect region when viewing it in front position of structural element. To further improve the proposed technique in more realistic cases, the use of a stereo camera together with the three-dimensional digital image correlation method will be beneficial for developing this detection scheme that allows for three-dimensional measurement of structural response at one position. In addition, algorithms that automatically extract the vibration amplitude at defect region in time series from the magnified video would be highly useful for better characterizing of defect in bonded structural system. The time series vibration amplitude can be further transferred into the frequency spectrum so that the natural frequency of local defect region can be acquired. This natural frequency can be further taken to quantify the defect area of structure. In addition, the effect of defect size on the inspection results
from this methodology needs to be investigated. Too small defect area can lead to large natural vibration frequency, which requires higher frame rate of camera recording. It is necessary to figure out the minimum defect size detected by this video processing technique and its relation to the capacity of high-speed camera. Furthermore, modal analysis (e.g., measurement of the quantitative two-dimensional deflection shapes) from the magnified video benefits the understanding of dynamic properties of the FRP-bonded structural system.

6 | CONCLUSION

The results of an experimental study to investigate the ability of phase-based motion magnification video processing technique to detect interfacial defect between FRP composite and basis material are presented in this paper. Research findings demonstrate that under an instant air blow, the surface motion at the defect region of FRP-bonded structural system is hard to be perceived without applying the motion magnification technique. However, the motion behavior at the defect region can be clearly distinguished from the intact region when adopting this methodology, justifying the effectiveness of phase-based motion magnification for defect detection in FRP-bonded structural systems. Our investigation also indicates that the appropriate selection of bandpass frequency range is critical to the detection accuracy of structural system. When the filtered frequency range covers the natural frequency of structural vibration, the motion can be magnified more efficiently and effectively. Besides, the motion amplification factor should be selected carefully during the video processing. Too large motion amplification factor can lead to image distortion and can result in an inaccurate detection. In this paper, recommendations are provided for selecting the appropriate bandpass frequency range and motion amplification factor for the video processing technique when it is applied in defect detection of FRP-bonded structural systems.

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