# Experiments on Chaotic Vibrations of an Arch Deformed by an Initial Axial Displacement

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**Abstract.** Experimental results are presented on chaotic vibrations of a shallow clamped arch subjected to periodic lateral acceleration. The arch is compressed by an initial axial displacement, then the lowest mode of vibration of the arch has asymmetric form to the mid span. The arch shows characteristics of soften-and- hardening spring involving snap-through transition. Chaotic responses including dynamic snap-through transition and internal resonances are inspected with the maximum Lyapunov exponents, the Fourier spectra and the Poincaré maps. Mode contributions to the chaos are examined with the principal component analysis. It is found among other conclusions that: In the chaotic response with the dynamic snap-through generated from the nonlinear periodic resonance of the lowest mode with the asymmetric form, the vibration mode with the symmetric form has dominant contribution to the chaos.

# 1. Introduction

Thin walled structures are utilized in many vehicles. Arches and beams are fundamental elements of such structures. Since an arch has a curved configuration, the bending stiffness of the arch is much larger than that of a beam. Increasing the curvature of the arch and the axial compressive displacement to the arch, the stiffness also increases. However, when the arch is subjected to lateral load which exceeds a critical magnitude, the arch loses its stability by snap- through buckling. Asymmetric deformation is induced in a deep arch. Further, when the arch is excited by a periodic force, then a large amplitude vibration is generated by resonance. In typical regions of the excitation frequency, chaotic responses are abruptly generated. It is expected that multiple modes of vibration are involved in the chaotic response. Since nonlinear response of the arch has strong coupling with the axial compressive displacement, the generation of the chaos is affected drastically by the curvature and the axial displacement.

Nonlinear vibrations and chaotic phenomena of arches and beams were studied by many researchers including the authors [1-8]. The authors have investigated the nonlinear vibrations of an arch [9,10] and chaotic vibrations of a post-buckled beam [11-15] both experimentally and analytically. The predominant chaotic responses were generated from the sub-harmonic resonance responses. Further, authors conducted the experiment of a post-buckled reinforced beam [16], the experiment of a post-buckled cantilevered beam connected by a string to an axial spring [17] and analysis of a post-buckled L-shaped beam [18].

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To reveal the chaotic phenomena of an arch compressed in an axial direction, experimental results are presented of the chaotic vibrations of the arch under periodic acceleration. A thin arch is clamped at both ends and is compressed by the initial axial displacement. The arch is deformed to large curvature. Under the periodic lateral acceleration, the chaotic responses of the arch are inspected with the frequency response curves, the maximum Lyapunov exponents, the Fourier spectra and the Poincaré projections. Furthermore, detecting chaotic responses simultaneously at multiple positions of the arch, mode contribution to the chaos is analyzed with the principal component analysis.

#### 2. Test Arch

Fig. 1 shows the test arch fixed on a base frame. A phoshor-bronze arch with thickness h=0.32 mm, breadth b=30 mm and length 280 mm is clamped at the both ends by two rigid blocks on the base frame. The surface of the rigid block is cut to a circular surface. The arch has the effective length L=180 mm and the mean radius  $R=1.1\times104$  mm. The arch is painted with acrylic resin of white color. The white surface of the arch is used as a reflection-target of a laser displacement sensor. Material properties are obtained as the Young's modulus E=102 GPa and the mean mass density  $\rho=8.9\times10^3$  kg/m<sup>3</sup>. Controlling thermal elongations of the arch and the base frame, the initial axial displacement is applied to the arch. Consequently, the arch has larger curvature than that of the mean radius R. As shown in the figure, the coordinate system is denoted by x-axis along the arc of the radius R and z-axis in the radial direction. The lateral deflection of the arch is denoted by W(x,t).



Fig. 1. Test arch

## 3. Vibration Test And Procedure

To summarize the results of the experiments, the following non-dimensional notations are introduced.

$$x = x / L, w = W / h, a = L^{2} / Rr, [p_{s}, p_{d}] = [g, a_{d}](raL^{4} / EIr), q_{s} = Q_{s}L^{3} / EIr, t = W_{0}t, [W_{i}, W] = [f_{i}, f](2p / W_{0})$$
(1)

$$r = \sqrt{I/A}, W_0 = L^{-2} \sqrt{EI/rA}$$
<sup>(2)</sup>

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Where, r represents the radius of gyration of cross section of the arch,  $\Omega_0$  is the coefficient corresponded to lateral vibration of the arch. In Eq. (1),  $\xi$  is the non-dimensional coordinate, w is the deflection normalized by the thickness h of the arch. Notation  $\alpha$  is the non-dimensional mean curvature of the arch. Notations  $p_s$  and  $p_d$  are the non-dimensional force intensities related to the gravitational acceleration g and the periodic peak acceleration  $a_d$ , respectively. Notations  $\omega$  and  $\tau$  are the non-dimensional excitation frequency and the time, respectively. Non-dimensional excitation force is expressed as  $p_s + p_d \cos \omega \tau$ . When the restoring force of the arch is examined, static deflection under concentrated force Qs is measured. Notation  $q_s$  is the non-dimensional concentrated force.

The arch has the mean curvature  $\alpha = 32 \pm 2$ . To obtain precise results of chaotic responses of the arch, axial thermal elongation of the arch was kept constant during the vibration test. The arch is subjected to the static force  $p_s = 1.2 \times 10^3$  due to the gravity. The arch is examined under the amplitude of excitation  $p_d = 1.48 \times 10^3$ .

To find the fundamental characteristics of the arch, first, configuration of initial deflection due to the axial displacement and the gravity force on the arch is measured. Next, applying periodic acoustical pressure on the arch, linear natural frequencies are detected with the spectrum analyzer. Finally, the characteristics of the restoring force are examined.

A schematic diagram of the vibration test setup is shown in Fig. 2. In the test setup, the devices are divided into three sections of excitation, measurement and data analysis. First, the arch is excited by periodic acceleration with an electromagnetic exciter through the base frame. Next, dynamic time responses of the arch are detected with non-contact laser displacement sensors. Finally, chaotic responses are investigated as following procedure: to find frequency regions where chaotic responses are excited, the nonlinear frequency response curve is inspected. Time progresses of non-periodic responses are examined with the Fourier spectra, the Poincaré projections, the maximum Lyapunov exponents and the principal component analysis. The maximum Lyapunov exponent of the non-periodic response is calculated using the procedure by Wolf et al. [19] and Takens [20]. Increasing the embedding dimension *e*, the maximum Lyapunov exponent  $\lambda_{max}$  is evaluated. If the  $\lambda_{max}$  has a positive value, the response is confirmed as the chaos. Recording responses at multiple positions of the arch simultaneously, the principal component analysis [21,22] is applied. Contribution ratios of principal components and corresponded modal patterns in the chaotic vibration are discussed.

#### 4. Results and Discussion

#### 4.1 Fundamental Characteristics of the Arch

Fig. 3 shows the static initial deflection of the arch measured from the circular arc of the non-dimensional curvature  $\alpha$ =32. The maximum raise of the arc from the line which connects the arch ends is 1.2 times of the arch thickness. The maximum initial deflection is found  $\overline{w} = -2.3$  at the mid span of the arch, then the arch has large curvature. The initial deflection is caused by the effects of the initial axial displacement and the gravity force. The axial displacement is so small that



Fig. 2. Vibration test set up



Fig. 3. Configuration of initial deflection of the arch

it is difficult to measure directly. Thus, the axial displacement is identified indirectly by comparing the fundamental properties with that of the corresponding analysis. The fundamental properties correspond to the static initial deflection, linear natural frequencies and nonlinear restoring force. The initial axial displacement of this arch is estimated as the order of 10  $\mu$ m by the results of experiment [10] and the theory [9].

Table 1 shows the linear natural frequencies  $\omega_i$  and the corresponded modes of vibration. In the table, the lowest mode of vibration has the asymmetric configuration. The asymmetric form has two half-waves along the arch. This asymmetric form in the vibration is due to the large curvature of the arch. The second mode of vibration shows the symmetric form which is superimposed with the configurations of one half-wave and of three half-waves. Since the modes of vibration of second order and of third order have the relation  $\omega_2/2\approx\omega_3/3$ , the condition of internal resonance is satisfied.

Fig. 4 shows the static lateral deflection w of the arch measured at  $\xi=0.31$  under the concentrated force  $q_s$  loaded at the mid span of the arch. In the figure, the characteristics of nonlinear restoring force show the type of soften-and-hardening spring including snap-through transition. When the force increases from the stable equilibrium position of the arch, the arch deflects inward with the type of the softening spring. As the deflection is close to w=0.25, the snap-through buckling appears.

Table 1. Linear natural frequencies and vibration modes of the arch

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Fig. 4. Static deflection of the arch under concentrated load

Then, the arch transits to the larger deflection w = 4.3. As the deflection increases more than w = 4.3, the restoring force shows the hardening type of nonlinearity. Without the concentrated force, this arch has two stable equilibrium positions.

## 4.2 Frequency Response Curves of the Arch

Nonlinear response curves of the arch are recorded under the periodic excitation force  $p_d \cos \omega \tau$ . The results are shown in Fig. 5. Varying the excitation frequency  $\omega$ , the dynamic response of the arch at the point  $\xi$ =0.31 is recorded by the root mean square value wrms. Notation (*i*, *j*) denotes the steady-state periodic response of resonance, in which *i* is a generated mode of vibration, while *j* indicates a type of resonance. For example, *j* =1 indicates the principal resonance, while *j* =1/2 is the sub-harmonic resonance of 1/2 order. A chaotic response is represented by the notation C(*i*, *j*), in which (*i*, *j*) corresponds to the dominant mode of vibration and the type of resonance.

Since the arch has the characteristics of the soften-and-hardening spring, as the excitation frequency is decreased, resonant responses are generated easily from the non-resonant responses. When the excitation frequency  $\omega$  approaches to  $\omega_3$  from upper region, the non-resonant steady-state response transits to the other non-resonant response of  $w_{\rm rms}$ =4.3. The response involves the static large deflection. At the frequency  $\omega$ =84.4, the chaotic response C(1,1/2) is generated together with

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Fig. 5. Frequency response curves of the arch

the dynamic snap-through transition from the sub-harmonic resonance (1,1/2). The vibration mode (1,1/2) has the asymmetric form. At the frequency  $\omega$ =46.5 in the principal resonance of the lowest mode of vibration, chaotic resonance C(1,1) is also generated with the dynamic snap-through. The chaotic response shows non-periodic amplitude variation. At the frequency  $\omega$ =44.0, the chaotic response jumps to the non-resonant response. In the lower frequency region of the super-harmonic resonance of (2,2), at the frequency  $\omega$ =37.0, the chaotic response of the type of internal resonance C(2,2:3,3) appears. The internal resonance satisfies the condition  $\omega_2/2\approx\omega_3/3$ . Furthermore, at  $\omega$ =35.6, the chaotic response of C(2,2) is excited with the dynamic snap-through. When the excitation frequency is increased continuously from lower frequency region, the chaotic response with the internal resonance C(2,2:3,3) and the chaotic responses with the dynamic snap-through C(1,1) and C(1,1/2) are also generated again.

## 4.3 Inspection of Chaotic Responses of the Arch

Based on the time progresses of the non-periodic response at  $\xi$ =0.31 of the arch, the maximum Lyapunov exponent is calculated by the Wolf's method. Fig. 6 shows the maximum Lyapunov exponents  $\lambda_{max}$  related to the embedding dimension *e* of the chaos of C(2,2:3,3), C(1,1) and C(1,1/2).

In the figure, the maximum Lyapunov exponent of the chaos C(2,2:3,3) takes the value within  $\lambda_{max}=1.0$  and  $\lambda_{max}=1.3$  as the embedding dimension exceeds e=6. For the chaotic responses of C(1,1) and C(1,1/2), the maximum Lyapunov exponents range from  $\lambda_{max}=4.8$  to  $\lambda_{max}=5.6$ , near the embedding dimensions exceed e=8 or e=9. Since the maximum Lyapunov exponents of these responses take the positive values, these responses are confirmed as the chaos. The maximum Lyapunov exponent and the corresponded embedding dimensions of the chaos C(2,2:3,3) with the internal resonance take smaller values than those of the chaotic responses C(1,1) and C(1,1/2). Half of the embedding dimension corresponds to the number of predominant vibration modes that contribute to the chaotic response ([3]Pezeshki and Dowell (1989)).

Chaotic responses are discussed by the time progress, the Poincaré projection and the Fourier spectrum. Fig. 7 indicates the results of the chaos of the internal resonance C(2,2:3,3) at the



Fig. 6. Maximum Lyapunov exponent related to embedding dimension

frequency  $\omega=38.2$ . In Fig.7-(a), the time progress of the non-dimensional deflection *w* is presented by the number of excitation period  $\tau_e$ . The chaotic response vibrates in small amplitudes. Center of peak amplitudes of the response shifts to the positive direction from the origin. The positive direction implies the inward direction of the arch from the static equilibrium point. Consequently, the arch will be compressed axially during the vibration. Fig. 7-(b) shows the Poincaré projection. In the phase space of the deflection *w* and the velocity  $w_{,\omega\tau}$ , 6000 points are plotted on the phase delay  $\theta=\pi/3$  from the peak amplitude of the periodic acceleration. The projections within the deflection *w*=0.1 and *w*=0.3 shows the condensed figure, while in the range from *w*=0.4 to *w*=0.7, the projections are focused in band- like strips. The Fourier spectrum of the response is shown in Fig.7-(c). The abscissa represents the non-dimensional Fourier frequency  $\omega_{sp}$ , while the ordinate stands for the frequency spectra *A* which is scaled by decibel. Dominant spike of spectrum appears at  $\omega_{sp}=76.5$  which is twice of the excitation frequency. The response corresponds to the super-harmonic resonance of order two with the second mode of vibration. Furthermore, the peak spike at  $\omega_{sp}=116$  corresponds to the super-harmonic resonance of order three related to the third mode. Consequently, the chaotic response is cooperated with the internal resonance which satisfies the relation  $\omega_2/2\approx\omega_3/3$ .

Fig. 8 shows the chaotic response C(1,1) with the dynamic snap-through. In Fig. 8-(a), the large amplitude time response shows non-periodic behavior. Further, the response transits irregularly around the two stable equilibrium points. In Fig. 8-(b), the Poincaré projections of this response prevails uniformly over the range from w=-0.5 to w=6. Condensed dotted figure can be observed around w=0. From the Fourier spectrum in Fig. 8-(c), predominant peak indicates the response of principal resonance with the lowest mode of vibration. Broad band spectrum is observed compared with the chaotic response with the type of internal resonance in Fig. 7-(c).

Fig. 9 shows the chaotic response C(1,1/2) with the dynamic snap-through. Compared with the results of C(1,1), the chaotic response also transits between the two stable equilibrium points randomly. However, the chaotic response involves the sub- harmonic response with amplitude modulation around the equilibrium point of the large deflection w=4.3. Further, the response around the deflection w=0 shows complicated non-periodic vibration. In the Fourier spectrums shown in

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Fig. 7. Chaotic response of the type of C(2,2:3,3),  $\omega=38.2$ .

Fig. 9-(b), peak spectrum  $\omega_{sp}$ =39.9 indicate the predominant component of the sub-harmonic resonance of order 1/2 with the first mode of vibration.

## 4.4 Contributions of Vibration Modes to the Chaos of the Arch

The principal component analysis (Loeve (1955)) enables one to estimate a contribution ratio of vibration modes in the chaotic response of the arch. The chaotic time progresses of deflection are measured simultaneously at five positions along the arch. Measuring positions are  $\xi$ =0.08, 0.31, 0.5, 0.69 and 0.92. Applying the analysis to the multiple time data of the chaotic responses, contribution ratio and related modal pattern are calculated. The modal pattern for the chaos C(2,2:3,3) with the internal resonance is shown in Fig.10. The modal patterns  $\varphi_i$  related to the principal component are illustrated in the order of eigenvalue *i*. Contribution ratio is also listed in the figure. The internal resonance is cooperated with the second and third modes of vibration which are symmetric to the mid span of the arch. The largest contribution in the principal components prevails 68%. Its modal pattern corresponds to the second mode of vibration with the symmetric form. The contribution ratio of the third mode to the chaotic response is 2.9%. However, the contribution ratio of the first mode of



Fig. 8. Chaotic response of the type of C(1,1),  $\omega$ =47.5.

vibration with the asymmetric form takes 29%. Consequently, for the chaotic response with the internal resonance C(2,2:3,3), the lowest mode of vibration with the asymmetric form have significant contributions to the chaos as well as the second and third modes with the symmetric form.

Fig. 11 shows the result of the chaotic response C(1,1) in the principal resonance of the lowest mode having the asymmetric form. The most significant modal pattern is the second mode of vibration with the symmetric form which has contribution ratio of 87%. The response is generated involving the dynamic snap-through. The contribution of the modal pattern with the lowest mode of the asymmetric form has 12%, while the higher modes contribute less than 2%.

When the chaotic response C(1,1/2) with the dynamic snap-through is generated from the subharmonic resonance of the lowest mode with the asymmetric form, the contribution of the second mode with the symmetric form increases to 94%, while that of the lowest mode is 5.5%, because the principal resonance of the second mode with the symmetric form is close to the chaotic response.



Fig. 9. Chaotic response of the type of C(1,1/2),  $\omega$ =83.0.



Fig. 10. Modal pattern in the chaotic response of the arch obtained by the principal component analysis,  $\omega$ =38.2, C(2,2:3,3).

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Fig. 11. Modal pattern in the chaotic response of the arch obtained by the principal component analysis,  $\omega$ =47.5, C(1,1).

# 5. Conclusion

The precise experiments have been carried out on the chaotic vibrations of a clamped arch constrained by the initial axial displacement. The main results are summarized as follows:

- (1) Dominant chaotic responses of the arch are generated from the frequency regions of the nonlinear periodic resonances. In the typical frequency region of the internal resonance, the chaotic response is generated in relatively small amplitude. In the regions of the sub-harmonic resonance of 1/2 order and the principal resonance corresponded to the lowest mode of vibration, large amplitude chaotic responses appears involving the dynamic snap-through.
- (2) The maximum Lyapunov exponents of the chaos with internal resonance has the smaller value  $\lambda_{max}=1.2$  than the value  $\lambda_{max}=5$  of the chaos with the dynamic snap-through. The Poincaré projection of the chaos with the internal resonance shows band- like strips, while that of the chaos with dynamic snap-through indicates distributed figure.
- (3) In the chaotic response of the internal resonance cooperated with the second and third modes of vibration with the symmetric forms, the lowest mode of vibration with the asymmetric form contributes one-third of the total modes of vibration. When the chaotic response in the type of the dynamic snap-through is generated from the nonlinear periodic resonance, which has the lowest mode with the asymmetric form, the second mode of vibration with the symmetric form has dominant contribution to the chaos.

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