Estimation of Flutter Derivatives of Various Sections Using Numerical Simulation and Neural Network

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ABSTRACT

Recently, Computational Fluid Dynamic (CFD) method is being popular countermeasures for analyzing flow behaviors in wind engineering fields. This paper presents the reliability and the accuracy of numerical simulation and neural network method to predict flutter derivatives of rectangular section. The flutter derivatives are the essential parameters in the estimation of critical flutter wind speed in aero-elastic analysis of a flexible bridge. The flutter derivatives are found to be functions of the cross section geometry of the bridge deck and the reduced wind speed. The numerical simulations of flutter analysis for two-dimensional rectangular section are conducted by fluid-structure interaction method. The numerical simulations carried out for rectangular section, which is forced in vertical or torsional harmonic motion. From the results of numerical simulation, the flutter derivatives are compared with theoretical results and experimental data from forced vibration test. Overall, the calculated flutter derivatives and critical flutter velocity from the numerical simulation are in good agreement with those of wind tunnel test. Furthermore, additional estimated method, neural network, is attempted to propose a method estimating the flutter derivatives without wind tunnel test.

1. INTRODUCTION

The aero-elastic phenomena have seen for long-span bridges are flutter, galloping, and vortex shedding induced vibration. Flutter is one of complicated issues to be considered in the design of long-span bridges. The unsteady aerodynamic forces due

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to the bridge deck motion are usually expressed in flutter derivatives (Scanlan 1971, Theodorsen 1935). Flutter derivatives plays an important role in predicting critical flutter wind speed for evaluating the flutter stability of bridges, and have been studied by many researchers (Ge 2000, Gu 2001, Matsumoto 2005). The wind tunnel test is the most general way to extract flutter derivatives of bridge section. However, it is well known that the flutter derivatives are closely related with test conditions, such as the reduced wind speed, amplitude of forced oscillation and wind properties, etc. Recently, the role of numerical simulation increased as a powerful method for studying various wind effects on bridges, which are not suitable for wind tunnel investigation. Many numerical simulation studies have been conducted for estimation flutter derivatives of bridge sections (Frandesen 2005, Simonsen 2008, Xin 2010, Huang 2011). Also, (Chen 2003, Chen et al. 2008) have proposed a neural network approach to predict the flutter derivatives of rectangular section models using free vibration test data. In this paper, the numerical simulation performed for evaluating flutter derivatives of rectangular section. The critical flutter wind speed is predicted from these flutter derivatives. The results obtained by numerical simulation are compared with the experimental ones to validate the numerical simulation approach. Also, backpropagation neural network is attempted to estimate the flutter derivatives using forced vibration test data

2. WIND TUNNEL TEST

The force and free vibration tests are performed to investigate flutter instability of B/D=20 aspect ratio of rectangular section in the wind tunnel test at TESolution Co. ltd, Korea, as shown in Fig. 1(a). The section of the wind tunnel is 1.0m (width) × 1.5m (height) × 6.0m (length) and range of test wind velocity are 0.3m/s ~ 22.5m/s. Experimental rig for the forced vibration test is shown in Fig. 1(b). The maximum speed of the motor is 1,150 RPM. A minimum and maximum oscillation frequency of the model can be control 0.02Hz to 4.0Hz. The range of the amplitude and the rotation angle are ±60.0 mm and ± 30.0°, respectively. The flutter derivatives for the rectangular section are extracted by the experimental rig.





(a) Wind tunnel for section model test (b) Experimental rig for vibration test Fig. 1. Layout of wind tunnel facility

3. NUMERICAL SIMULATION SETUP

The description of numerical simulation setup is given in this section. Finite volume method applied for solving incompressible Navier-Stokes equation. The diffusive terms are solved by a second-order central difference scheme, and the convection terms are computed by the second-order upwind scheme. The pressure-implicit SIMPLE algorithm is used to solve the pressure-velocity coupling equation. To simulate unsteady simulation, the steady-state simulation is conducted for initializing the flow field of the computation domain. In order to overcome the problem of free-stream dependency of the k- ω model and to prevent the over-prediction of length scales near the wall by the k- ϵ model, Menter (1994) introduced the Shear Stress Transport (SST) model. The SST model accounts for the transport of the turbulent shear stress inside boundary layers by modifying the turbulent eddy-viscosity function. SST has been shown to predict better flow separation compared to both k- ϵ and k- ω models. From these reasons, the k- ω SST turbulence model is employed to simulate the turbulent flow in this simulation.

The two-dimensional computational domain and the whole computational domain have two grid regions as Fig. 2. The two grid regions, stationary and dynamic regions, applied to the whole computational domain. The stationary region was not deformed while the dynamic region was deformed by the bridge motion at each time step. The grid region near the bridge sections is deformed with moving section at every calculation time step. The number of grids in stationary and dynamic regions is 12,855 quadrangular grids and 94,292 triangular grids with body-fitted grid, respectively. Near edges the grid has refined and the y+ height of body-fitted grid is around 1 for the k- ω SST model. The boundary conditions are defined as; the inlet boundary is defined as uniform velocity condition, the outlet boundary is defined as pressure outlet condition, the upper and lower boundaries are defined as symmetry condition, and the surface of plate is defined as wall condition.



Fig. 2. Grid distribution of computational domain

The B/D=20 aspect ratio of rectangular section is forced to move either vertically to the flow direction or rotationally in a sinusoidal motion with constant amplitude. The amplitudes of the vertical and rotational motions are chosen as 0.02 m and 4.0° for translation and rotation. The motion is harmonic motion, and the rotation is defined as positive clockwise and the translation is positive upwards as shown in Fig. 2. For each harmonic motion, approach velocities were considered from 0 m/s to 20 m/s. The summary of parameters of test is given as Table 1.

Velocity (m/s)	Forced vibration frequency (Hz)	Amplitude for vertical forced vibration (m)	Amplitude for torsional forced vibration (°)
0.0 ~ 20.0	2.0	0.02	4.0

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4. BACK-PROPAGATION NEURAL NETWORK FOR FLUTTER DERIVATIVES

Generally, the flutter derivatives are extracted by wind tunnel test such as free vibration test or forced vibration test. However, the wind tunnel test consumed much time and cost to perform the test. Therefore, a method for estimating the flutter derivatives without the wind tunnel test is expressed in this section. Generally, natural phenomena are not easy to show the relationship with cause and effect using formula. Recently, in order to solve the problem, neural network is often used. Fig. 3 shows the structure of the neural network used in this study. The width-to-depth ratio (B/D), reduced frequencies (K = $B\varpi/U$) and reduced velocities (U_{red}) are used as input data of input layer while the flutter derivatives are used as desired output of neural network in training process. The B/D ratios of the rectangular sections are 5, 8, 10, 15 and 20 for training the neural network, where the flutter derivatives used for training are extracted by the forced vibration test. B/D=12.5 is used in order to verify this method. The eight neural networks are used to estimate the flutter derivatives (H_i^{*}, A_i^{*}, i = 1, ... 4) in this study.



Fig. 3. Structure of neural network

5. RESULTS

5.1 Numerical Simulation

Figs. 4 and 5 show that the calculated flutter derivatives for aspect ratio B/D=20 are compared with experimental results. Theodorsen's analytical results for a flat plate are also shown in the figures. From the figures, it can be seen that the calculated flutter derivatives are in good agreement with those of the wind tunnel test in the range of small reduced wind speed but there are some discrepancies of flutter derivatives between wind tunnel test and CFD as the reduce wind speed increases. This discrepancy has not much effect on estimating critical flutter velocity. Some discrepancies in Figs 4 and 5 could be reduced by more proper set up of numerical simulation, such as time step, turbulence models, grid size, etc.

From the flutter derivatives by numerical simulation, an estimated critical flutter wind speed is compared with the experimental results (Fig. 6). The predicted critical wind speed using CFD is good agreement with one is obtained by wind tunnel test (Table 2).



Fig. 6. Estimation of critical flutter wind speed

5.2 Neural Network Approach

The flutter derivatives estimated by the neural network are shown in Figs. 7 and 8. Although the training patterns have extremely limited in this study, most estimated flutter derivatives showed a good agreement with experimental results while H2* has a little difference against the experimental result.



Fig. 7. Comparison of the predicted and experimental flutter derivatives for the section with B/D 12.5 (vertical motion)



CONCLUSION

The main purpose of this study was to verify the potentiality of the numerical simulation for estimation flutter derivatives and critical wind speed. Based on the results of numerical simulation, the numerical results showed a reasonable agreement with the experimental results. Some of flutter derivatives using numerical simulation has discrepancies for increasing the reduced wind speed. The discrepancies could be reduced by more proper set up of numerical simulation, such as time step, turbulence models, grid size, etc. Also, another estimated method, neural network, is examined to propose a method estimating the flutter derivatives without wind tunnel test. Although the training patterns have extremely limited in this study, most estimated flutter derivatives showed a good agreement with experimental results. Further studies concerning three-dimensional numerical simulation of forced vibration, numerical simulation of free vibration for directly calculating critical flutter wind speed, the

effectiveness of turbulence models, and applications of real bridge section will be carried out.

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