

# Efficient Numerical Model for Studying Bridge Pier Collapse in Floods

Thanut Kallaka, Ching-Jong Wang

**Abstract**—High level and high velocity flood flows are potentially harmful to bridge piers as evidenced in many toppled piers, and among them the single-column piers were considered as the most vulnerable. The flood flow characteristic parameters including drag coefficient, scouring and vortex shedding are built into a pier-flood interaction model to investigate structural safety against flood hazards considering the effects of local scouring, hydrodynamic forces, and vortex induced resonance vibrations. By extracting the pier-flood simulation results embedded in a neural networks code, two cases of pier toppling occurred in typhoon days were re-examined: (1) a bridge overcome by flash flood near a mountain side; (2) a bridge washed off in flood across a wide channel near the estuary. The modeling procedures and simulations are capable of identifying the probable causes for the tumbled bridge piers during heavy floods, which include the excessive pier bending moments and resonance in structural vibrations.

**Keywords**—Bridge piers, Neural networks, Scour depth, Structural safety, Vortex shedding

## I. INTRODUCTION

RECENTLY, there are many reports on bridge failure by the rapid flood flows [1,2]. Some cases may be suspected of scouring effects. Sometimes debris flows along the river can increase flow density and flow pressures. Some piers and foundation structures may fail by excessive bending moments after hydrodynamic forces increase.

The hazard of scouring will depend on various geometries and sizes of hydraulic structures as it may reduce the stiffness of a bridge pier and its foundation until a failure occurs. Some of these failures may be related to the resonance between vortex frequencies and structural frequencies. The structural frequency is affected by the deep scouring too.

## II. METHODOLOGY

Fig.1 and Fig.2 provide an overview of methods and procedures applied in this study, where  $M_D$  = moment demand;  $M_0$  = moment capacity;  $f_{st}$  = Strouhal frequency;  $f_0$  = structural frequency.

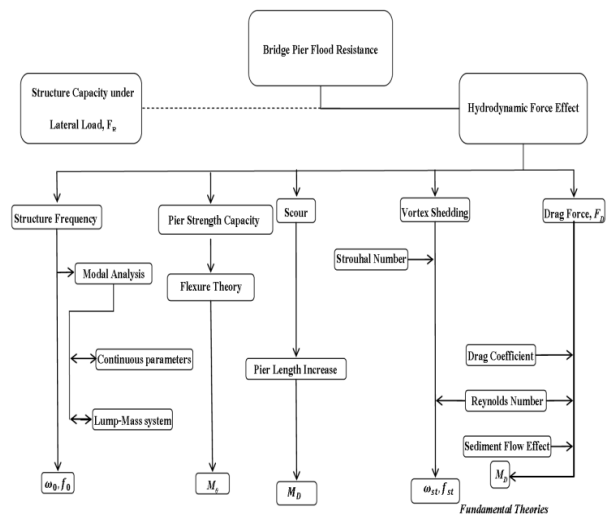


Fig. 1 Scope and methods of this study

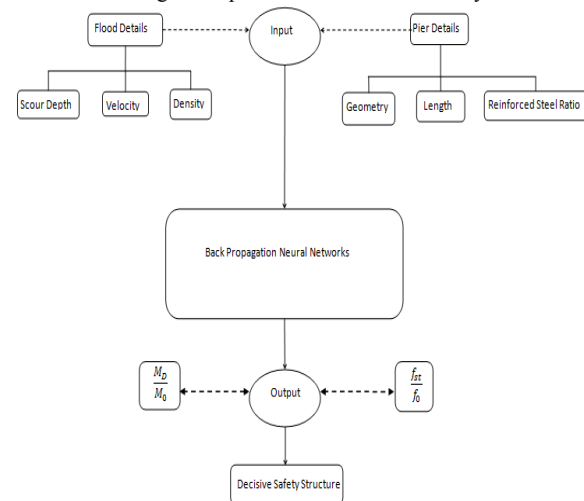


Fig. 2 Back propagation by neural networks

## III. BRIDGE DYNAMICS

A long bridge structure crossing a river is a 3D MDOF system (Fig.3). The modeling and analysis for a bridge response to flow-induced forces requires a general understanding of key principles in structural dynamics. Only those related to simplified design methods applicable to regular bridge structures are reviewed in the following.

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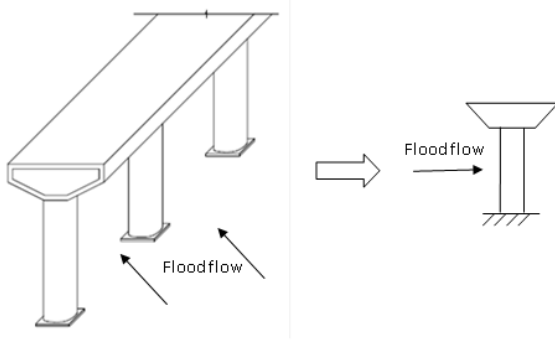


Fig. 3 Bridge dynamic model

#### A. Mass Calculations

Assuming a regular span of deck is simply supported on a pier bent, the pier and deck are modeled as a two-dimensional MDOF system. To capture higher mode effects, more discrete mass locations and associated DOFs are to be modeled. A simplified SDOF system is appropriate when the pier column responds to external loading mainly in a flexural mode [3]. The generalized mass of the pier and deck in the SDOF system (Fig.4) is

$$m^* = m_1 + \frac{\bar{m}_c L}{3} \quad (1)$$

where  $m^*$  = generalized mass of pier;  $m_1$  = deck mass;  $\bar{m}_c$  = distributed pier mass;  $L$  = total pier length.

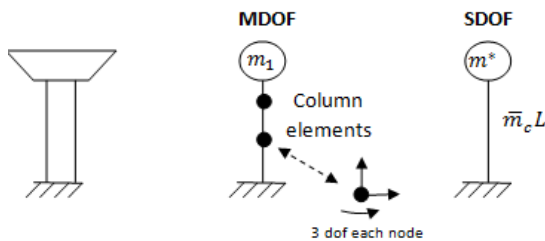


Fig. 4 Simplified pier and deck model

Given a mass  $m^*$ , a structural frequency  $f_0$  is then determined by the pier column stiffness based on an effective moment of inertia  $I_e$  that accounts for the cracked column cross-section.

The calculation for  $I_e$  depends on axial load ratio and longitudinal reinforcement ratio. For typical circular column cross-sections, usually the typical column reinforcement ratio is between 1 and 3% and axial load ratio is between 10 and 30%. Thus, an average  $I_e/I_g = 50\%$  is assumed, where  $I_g$  is the gross moment of inertia of the section [4].

#### C. Bending Moment Capacity

The reinforced concrete material model is from Mander et. al [4], as shown schematically in Fig.5, where strain  $\epsilon$  and stress  $\sigma$  must satisfy respectively the compatibility and equilibrium conditions for a given cross-section.

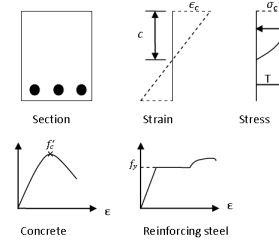


Fig. 5 Concrete and reinforcing steel behaviors

In this study,  $f'_c = 0.21$  Tons/cm<sup>2</sup> and  $f_y = 4.2$  Tons/cm<sup>2</sup> are assumed for pier column under investigation. Some of the moment-curvature analysis results including moment capacities  $M_0$  are shown in Fig.6 for circular sections and elliptical sections.

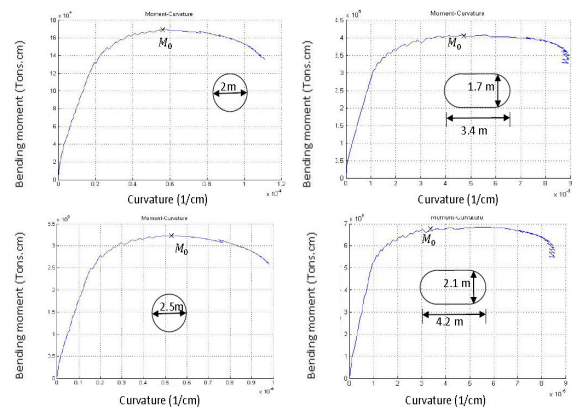


Fig. 6 Moment-curvature for pier columns (steel ratio = 1.5%)

#### IV. HYDRODYNAMIC EFFECTS

##### A. Drag Force

The distribution of hydrodynamic pressure is as shown in Fig. 7. The hydrodynamic force is computed by the product of hydrodynamic pressure and frontal area of the immersed pier column. In this study, the water level is assumed at 90% of pier height. The average pressure  $P_{avg}$  is calculated based on empirical drag coefficient  $C_D$  [5, 6],

$$P_{avg} = \frac{1}{2} C_D \rho V_{avg}^2 \quad (2)$$

where unit of  $\rho$  = flow density in  $\left[\frac{\text{Tons}}{\text{m}^3}\right]$ ,  $P_{avg}$  = pressure in  $\left[\frac{\text{kN}}{\text{m}^2}\right]$ ;  $V_{avg}$  = average flow velocity in  $\left[\frac{\text{m}}{\text{s}}\right]$ .

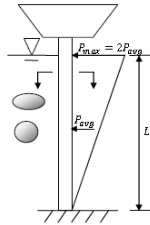


Fig. 7 Hydrodynamic drag force on piers

#### B. Vortex Shedding

The phenomenon of vortex shedding is characterized by the Strouhal frequency  $f_{st}$  as

$$f_{st} = \frac{St \cdot V}{D} \quad (3)$$

where  $St$  = Strouhal number;  $V$  = flow velocity;  $D$  = pier width. The Strouhal number is  $St$  a function of Reynolds number  $Re$ . This study considers  $St = 0.292$  for  $10^6 < Re < 10^7$  [7].

The velocity distribution over flow depth is as represented by a parabolic curve (Fig. 8). The vortex shedding frequency will vary as flow velocity. The occurrence of resonance between vortex shedding frequency and pier structural frequency is based on  $V_{avg}$  in an average sense [6,8].

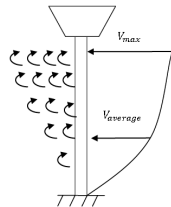


Fig. 8 Velocity distribution around pier structure

### V. EFFICIENT SIMPLE MODEL

#### A. Scour Depth

Local scour at pier base depends on bed material gradation, flow characteristics, and geometry of pier and foundation [9,10].

The effect of scouring on pier column force will be considered in a simple model composed of deck mass, pier column, pile cap, and foundation as given in Fig. 9.

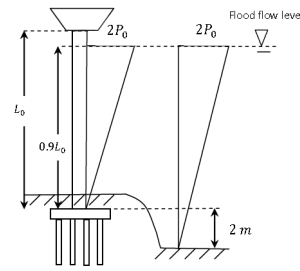


Fig. 9 A model to consider pier force due to scouring

Assume a maximum flood level at 90% of pier height and an average scour depth of 2 m below the column base.

In normal flood condition, the hydrodynamic force is

$$F_D = \frac{1}{2} \cdot 2P_{avg} \cdot A_e = P_{avg} \cdot A_e \quad (4)$$

Adding the 2-m scouring effect, it increases to

$$F_{SC} = P_{avg} A_e \left( 1 + \frac{2}{0.9L_0 + 2} \right) \quad (5)$$

where  $L_0$  is total length of the pier;  $A_e$  = frontal area for hydrodynamic force. For simplicity, the average pressure does not change by scouring.

A circular pier has 2 m in diameter and 8 m in height. The flow has a velocity of 4 m/s and density of 1.0 g/cm<sup>3</sup>. From drag force equation, bending moment results are as follows:

$$P_{avg} = 9.786 \times 10^{-5} \text{ Tons} \cdot \text{cm}^{-2},$$

$$M_{SC} = 7,470 \text{ Tons} \cdot \text{cm},$$

$$M_D = 6,764 \text{ Tons} \cdot \text{cm}$$

where  $M_D$  = bending moment without scouring effect;  $M_{SC}$  = bending moment adding scouring effect.

These results show that the scour can cause the hydrodynamic forces to increase significantly. The shear capacity against flow force is assumed adequate for ordinary pier columns.

#### B. Effect on Structural Stiffness

The scour depth affects the total length of pier column and in turn affects the structural frequency. A simple model to include this effect is given in Fig. 10.

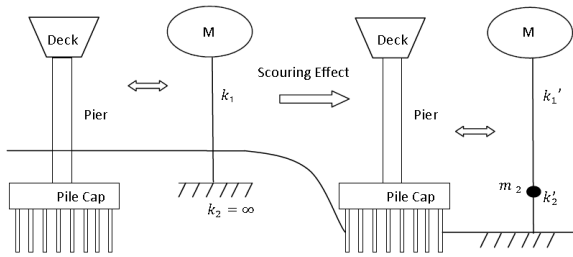


Fig. 10 A model for pier structural frequency due to scouring

The pier column stiffness changes from  $k_1$  to  $k_1'$ , and foundation stiffness also reduces to  $k_2'$ . The SDOF model assumes that  $m_2 = 0$  and  $k_2' = k_1'$ .

#### VI. NEURAL NETWORK SETUP

The flow parameters involve uncertainties in scour depth, flood level, flow velocity and others. Furthermore, the structural parameters also have some variations in cross-sections, pier lengths and others. To predict the probability of failure of any pier in flood, neural networks [11] are set up using more than 200 cases to train and refine. The prediction capability is only limited by the size of training data. The training algorithm is as shown in Fig.11.

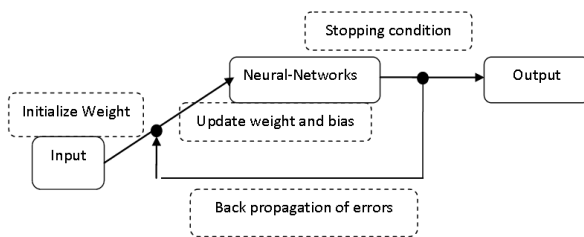


Fig. 11 Training algorithm of neural-networks

The activation function (F) for back propagation in this study is a bipolar sigmoid function as shown in Fig.12.

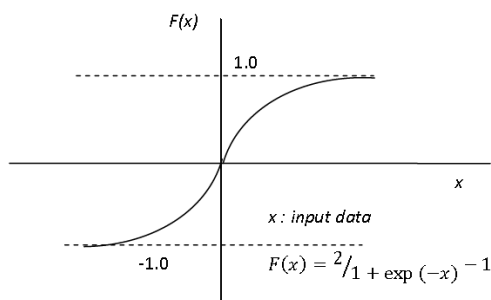


Fig.12 Bipolar sigmoid function

The results after training are presented in Fig.13 and Fig.14. The moment prediction is accurate for all ranges while the frequency ratio prediction is accurate in range of 0.7 to 1.2.

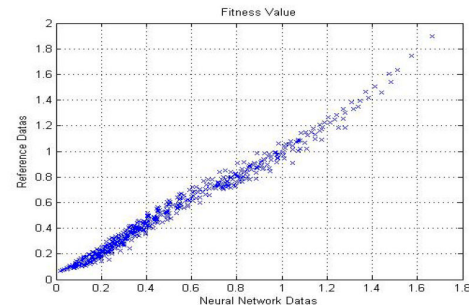


Fig. 13 Correlation for moment ratio: neural-networks vs. exact data (circular piers)

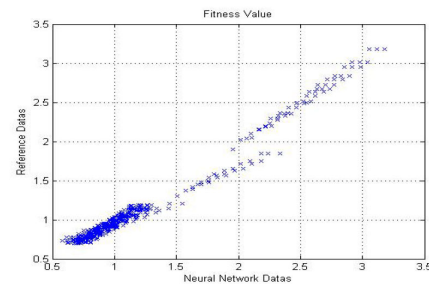


Fig. 14 Correlation for frequency ratio: neural-networks vs. exact data (elliptical piers)

#### VII. CASES OF PIER FAILURE IN FLOOD

##### A. Case 1, A Bridge in Flood around Mountain areas

As shown in Fig.15, a natural reservoir is built up by incident of land slides in a mountain side. The reservoir collects rainfalls and debris until it breaks up. This situation will cause a high velocity flash flood with debris in the river downhill [2].

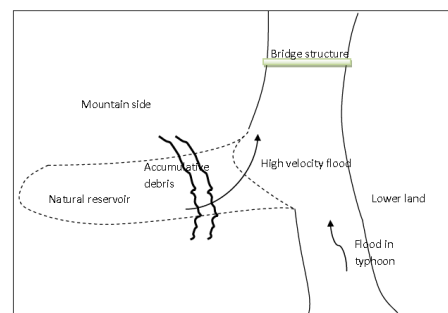


Fig. 15 Case 1: a bridge in flood around mountain areas

Debris and sludge come along during the high flood such that the flow density and flow pressure force rise much higher than normal. The increase in moment demand by deepening scour may overcome the pier's capacity. Furthermore, the vortex shedding frequency may rise to near the pier's structural frequency.

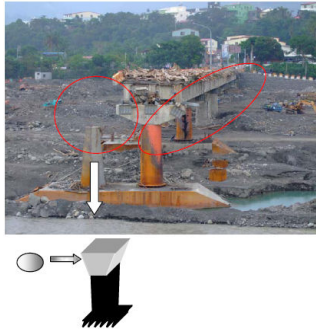


Fig. 16 Case 1: the bridge failure in flood

As shown in Fig. 16 is a bridge with several spans washed off completely. The pier column is circular with 2 m in diameter, 10 m in height, and 1.5% of reinforcing steel. A maximum scour 2 m is assumed.

Neural networks are applied to examine all likely conditions of pier failures. The simulated results for case 1 are given in Table 1 and it shows (highlighted rows) that

1. Piers may fail by resonant vibrations from vortex shedding for a moderate flow velocity of 5 to 6 m/s.
2. Piers may fail by excessive bending moment when a flow has a high velocity (12 m/s) and large density (1.6 g/cm<sup>3</sup>).

TABLE I  
CASE 1: FAILURE CONDITIONS OF A BRIDGE IN FLOOD

Flow density (g/cm <sup>3</sup> )	Flow velocity (m/s)	Frequency ratio ( $f_{st}/f_0$ )		Moment ratio ( $M_D/M_0$ )	
		Calculation	Neural Networks	Calculation	Neural Networks
1	4	0.708058	0.859531	0.068022	0.020602
1	5	0.897366	0.970805	0.106285	0.060839
1	6	1.076839	1.092205	0.15305	0.107916
1	13	2.333151	2.27053	0.718485	0.740348
1	14	2.512624	2.476797	0.833273	0.884288
1.3	4	0.717892	0.806597	0.088429	0.075942
1.3	5	0.897366	0.924392	0.13817	0.124676
1.3	6	1.076839	1.054157	0.198965	0.181772
1.3	12	2.153677	2.113239	0.795861	0.775271
1.3	13	2.333151	2.327782	0.934031	0.921956
1.3	14	2.512624	2.544806	1.083255	1.078888
1.6	4	0.717892	0.767986	0.108836	0.131415
1.6	5	0.897366	0.893434	0.170056	0.189782
1.6	6	1.076839	1.032757	0.24488	0.258179
1.6	11	1.974204	1.953862	0.82307	0.795983
1.6	12	2.153677	2.175074	0.979521	0.945161
1.6	13	2.333151	2.400678	1.149577	1.104347
1.6	14	2.512624	2.62517	1.333237	1.269203

Note that large-size drifts and floating objects may produce high impact force at the flooded deck, which is not included in this study.

#### B. Case 2, A Bridge in Flood near Coastal areas

As shown in Fig.17 is a stream near the estuary to the coast. Contrasted with Case 1, flood water here flows at a lesser speed and carries less debris. However, the streambed in such area usually consists of mainly fine sandy materials. As a result, a large scour depth is highly likely to cause a near-resonance from vortex induced vibration.

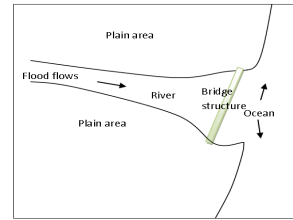


Fig. 17 Case 2: a bridge in flood around coastal areas



Fig. 18 Case 2: the bridge failure in flood

The pier column in Fig.18 has an elliptical cross-section with 1.7 m in nose diameter, 3.2 m in section depth, 8.5 m in height, and 1.5% of reinforcing steel.

TABLE II  
CASE 2: FAILURE CONDITIONS OF A BRIDGE IN FLOOD

Flow density (g/cm <sup>3</sup> )	Flow velocity (m/s)	Frequency ratio ( $f_{st}/f_0$ )	
		Calculation	Neural Networks
1	5	0.738353	0.812421
1	6	0.898329	0.933477
1	7	1.048051	1.063821
1	8	1.197772	1.202619
1.3	5	0.748608	0.81814
1.3	6	0.898329	0.94227
1.3	7	1.048051	1.075318
1.3	8	1.197772	1.216272
1.6	5	0.748608	0.809062
1.6	6	0.898329	0.935273
1.6	7	1.048051	1.070168
1.6	8	1.197772	1.212645

Simulated results are given in Table 2 which shows (highlighted rows) that the elliptical pier may fail due to vibrations from vortex shedding at low to moderate flow velocity of 6-7 m/s. For such elliptical piers, failure by excessive bending due to high density flow is not likely, however.

#### C. Case 3, An example of Thai Bridge in Flood

A flood incident caused the collapse of bridge pier columns around a hillside in Thailand. It was reported that land slides nearby had been observed.



Fig. 19 Case 3: the bridge failure in flood

The pier columns in Fig.19 have circular cross-sections with 2 m in diameter, 6 m in height, and 1.5% of reinforcing steel.

steel. However, this structure is simplified as single pier regarding to its total stiffness and mass against flood.

TABLE III  
CASE 3: FAILURE CONDITIONS OF A BRIDGE IN FLOOD

Flow density ( $\text{g}/\text{cm}^3$ )	Flow velocity (m/s)	Frequency ratio $\left(f_{st}/f_0\right)$	
		Calculation	Neural Networks
1	4	0.8403	1.0244
1	5	1.0996	1.1905
1.3	4	0.8976	0.9236
1.3	5	1.1376	1.0975
1.6	4	0.9100	0.8840
1.6	5	1.1376	1.0658

Simulated results are given in Table III which shows (highlighted rows) that the pier may fail due to vibrations from vortex shedding at low to moderate flow velocity of 4-5 m/s. For capped multi-circular piers, failure by excessive bending due to high density flow is not likely to occur.

#### VIII. CONCLUSIONS AND SUGGESTIONS

In this study, the failure of bridge piers in floods under effects of hydrodynamic force and scouring has been investigated. Based on a simplified model, the pier structures can be checked against failures by excessive bending moments and/or resonant vibrations.

In summary, the numerical simulations provide the most probable flow conditions that lead to the bridge failure in high floods. These conditions result from a proper combination of flow velocities, flow density, and vortex shedding, given a certain pier structural configuration. The neural networks developed can be an efficient tool for scanning similar pier structures for safety against flood induced rapid flows.

To avoid the failure by excessive bending moments or resonant vibrations in a high flood, piers of circular cross-sections are not recommended. The elliptical piers with aspect ratio of about 2.0 have shown their efficiency against high flow pressures, but the possibility of failure by vortex induced vibration during a high flood still exists.

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