# 2166. Modal identification of Karun IV arch dam based on ambient vibration tests and seismic responses

#### R. Tarinejad<sup>1</sup>, K. Falsafian<sup>2</sup>, M. T. Aalami<sup>3</sup>, M. T. Ahmadi<sup>4</sup>

<sup>1, 2, 3</sup>Faculty of Civil Engineering, University of Tabriz, Tabriz, Iran
<sup>4</sup>Faculty of Civil and Environmental Engineering, Tarbiat Modares University, Tehran, Iran
<sup>1</sup>Corresponding author **E-mail:** <sup>1</sup>*r\_tarinejad@tabrizu.ac.ir,* <sup>2</sup>*kfalsafian@tabrizu.ac.ir,* <sup>3</sup>*mtaalami@tabrizu.ac.ir,* <sup>4</sup>*mahmadi@modares.ac.ir*

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**Abstract.** This paper focuses on the operational modal analysis of the Karun IV dam, the highest concrete arch dam in Iran, based on the responses obtained from ambient vibration tests, which are carried out on the dam during 19 March 2014, and 3 March 2015 earthquake with an epicenter about 133 km northeast of the dam. The non-parametric FDD-Wavelet method is used for identification and extraction of modal parameters including natural frequencies, mode shapes and damping ratios. Nine and four natural frequencies are identified from ambient and seismic responses, respectively. Stabilization diagram and averaged coherence spectrum (ACS) are used to detect and eliminate spurious form true modes. Comparison of the results indicates that identification is performed properly and reliably.

Keywords: operational modal analysis, Karun IV arch dam, ambient vibration, FDD-Wavelet method.

#### 1. Introduction

Performance evaluation of an arch dam during a large earthquake is one of the engineering challenging problems. Dynamic properties of the dam such as, natural frequencies, mode shapes and damping ratios, are the most important factors in the response of the structure to the earthquakes. System identification methods provide these modal characteristics, which are important to achieve the seismic response of dams. The accuracy of the results obtained from seismic analysis depends on having a precise mathematical model that is known as modal model of the system. The most reliable method to achieve the precise mathematical model is calibration of these models by the results obtained from recorded real responses. The real responses can be obtained from the recorded responses during the earthquakes by permanent installed accelerometers on the dam or arranging vibration tests. The mathematical model should be updated so that the precise modal parameters are obtained conforming to the results from the OMA. Therefore, the calibrated mathematical model can be used to evaluate the safety of the existing dams, to predict the response to the destructive earthquakes, to assess the possibility of the damages under extreme loadings and structural health monitoring.

In operational modal analysis, dynamic characteristics of a structure can be extracted using techniques such as peak picking (pp) and Frequency Domain Decomposition (FDD) in the frequency domain [1-4], Stochastic Subspace Identification (SSI) in the time domain [5], and continuous wavelet transform (CWT) in the time – frequency domain [6-7]. The integrated FDD-WT method is introduced in which the wavelet transform is used for decomposition of a signal corresponding to the natural frequencies obtained from the FDD to enhance the estimation of damping ratios [8-10].

In this paper, comprehensive ambient vibration tests are carried out on the dam for six arrangements of sensors on March 19, 2014. The water level was 21 meters below the crest level during ambient vibration tests. On March 3, 2015, Karun IV dam was weakly shaken by the magnitude 1.6 earthquake, which occurred in Isfahan province. The water level during this earthquake was 11 meters lower than the corresponding level to the ambient vibration tests. As

the novelty of this research, these two kinds of actual responses of the dam are used for operational modal analysis. The results from ambient vibration tests (weak noises) and seismic responses of the dam (slightly strong noises) are compared and discussed to assure the achieved dynamic properties of the dam.

## 2. System identification using the FDD-WT method

## 2.1. Definition

Based on the works of Tarinejad and Damadipour (2014), a non-parametric integrated method under the title of FDD-WT was extended to identify the modal parameters of structures [8-10]. In this method, FDD extracts the values of natural frequencies and mode shapes. In the FDD identification, the first step is estimation of the PSD matrix. The output PSD  $\hat{G}yy(j\omega)$  known at discrete frequencies  $\omega = \omega_i$  is then decomposed by taking the SVD of the matrix [4]:

$$\hat{G}yy(j\omega_i) = U_i S_i U_i^{\ H},\tag{1}$$

where the matrix  $U_i = [u_{i1}, u_{i2}, ..., u_{im}]$  is a unitary matrix holding the singular vectors  $u_{ij}$ , and  $S_i$  is a diagonal matrix holding the scalar singular values  $s_{ij}$ . If the power spectral density matrix of the system can be decomposed into its singular values and vectors in the desired frequency, peaks of the first singular value will be equal to the natural frequencies of the system and singular vectors corresponding to the peaks of first singular values approximate the mode shape vectors.

On the other hand, Wavelet transform decouples the measured multicomponent signal to monocomponent signals (i.e. Decouple the signal with several frequency components to single signals with only one frequency component) therefore, it is capable to estimate damping ratios.

## 2.2. FDD-WT algorithm

After estimating the PSD matrix and decomposition of the power spectral density matrix into its singular values and vectors in the desired frequency [8-10]:

1) Peaks of the first singular value will be equal to the natural frequency of system. Second singular value can be used to estimate the natural frequencies of weak modes that have no peak in first singular value.

2) Singular vectors corresponding to the peaks of the first singular values approximate the system mode shape vectors.

3) Optimum parent wavelet based on minimal Shannon entropy criterion is determined and continuous wavelet transform (CWT) of system responses is calculated. Then, ridges and skeletons of CWT are selected corresponding to the desired frequencies which are extracted in step 1. The algorithm of FDD-WT method is illustrated in Fig. 1.





# 3. Case study

Karun IV Dam is a concrete arch dam on the Karun River located at 180 km southwest of Shahre Kord, Iran. The dam height is 230 metres (750 ft) from the foundation and the thickness of the dam varying from 7 meters at the crest to 37-52 meters at the base. The crest is approximately 440 meters in length. The general view of Karun IV Dam is shown in Fig. 2.

In 2010, an extensive array of tri-axial accelerometers was installed on Karun IV dam. The locations of the 9 accelerometers on the dam and along the abutments are shown in Fig. 3.

These accelerometers were in place on March 3, 2015, when the magnitude 1.6 earthquake occurred with an epicenter about 133 km northeast of the dam and a focal depth of about 10 km. During the earthquake, acceleration responses of the dam were recorded in all channels. The water level was 32 meters below the crest level during the earthquake.



Fig. 2. General view of Karun IV dam



## 4. Ambient vibration tests

Six different arrangements of sensors (A, B, C, D, E and F) during ambient vibration tests on the Karun IV dam are shown in Fig. 4. The velocity responses of the dam were measured in three directions, stream, cross-stream and vertical, using tri-axial seismometers. Structural responses due to ambient vibration recorded in stream direction are selected to identify the modal parameters. The records relating to each arrangement of seismometers is obtained simultaneously in three directions, cross-stream, vertical and stream, with a sampling time interval of 0.005 s. According to the recording schedule presented in Table 1, a total time of approximately 600 s is used for each arrangement except for the case of F that is 300 s.



Fig. 4. Location of the sensors for six arrangements A, B, C, D, E and F (downstream view)

The tests were mainly performed in the crest level and 93 % height of the dam, which is about 16 m below from the crest. Two tests with arrangements C and D were also performed in which the sensors were placed on blocks 0 and 9 (see Fig. 4). Fig. 5 show a sample of time histories recorded at the different stations for north-south direction for arrangement A.

Tuble 1. Recording schedule for six different diffugements				
Sensor arrangement	Active stations	Date	Recording time	Used time
А	1, 3, 4 and 5		07:47 – 07:59 AM	07:48 – 07:58 AM
В	1 to 4		11:00 – 11:26 AM	11:08 – 11:18 AM
С	1 to 4	2014 02 10	14:01 – 14:31 PM	14:11 – 14:21 PM
D	1, 3 and 4	2014-03-19	16:00 – 17:00 PM	16:25 – 16:35 PM
Е	1		18:15 – 19:00 PM	18:30 – 18:40 PM
F	1 and 4		19:53 – 20:00 PM	19:54 – 19:59 PM

Table 1. Recording schedule for six different arrangements



Fig. 5. Sample of velocity responses recorded at different stations of arrangement A in stream direction

# 5. Seismic records of 3 March 2015 earthquake

The seismic responses relating to the magnitude 1.6 earthquake of 3 March 2015 were recorded at Karun IV dam by tri-axial accelerometers with a sampling rate of 200 Hz. The stream direction accelerations recorded at the crest level of the dam are presented in Fig. 6.



## 6. Modal identification of Karun IV dam

Considering that the FDD-WT method is based on output-only technique, velocity responses obtained from the stations of six various arrangements A to F are used to review and identify the dynamic characteristics of Karun IV arch dam. Identification process is performed according to the presented algorithm in Fig. 1. In this paper, cyclic averaging technique is used to decrease analysis time and increase of processing precision. The use of cyclic averaging, along with asynchronous or synchronous averaging, is a powerful technique for reducing the leakage, as well as, random errors [12]. Signal processing is performed with 10 cyclic averages. Therefore, for arrangements A to E, averaged signals with time length of 60 s are used instead of them with 600 s and for arrangement F, the signals with time length of 30 s are used to analyze.

Ambient excitation forces can lead to appear spurious peaks in power spectrum of responses. There are some criterions to detect and eliminate spurious modes such as ACS (Averaged Coherence Spectrum) criterion and stabilization diagram. These two criterions are used in this paper.

#### 6.1. Averaged coherence spectrum

The ACS criterion is based on averaging the coherence spectra calculated between different response channels [8, 9]:

$$\gamma = \frac{\sum_{i=1}^{n} \sum_{j=1}^{n} \gamma_{ij}^2}{n^2},\tag{2}$$

$$\gamma_{ij}^2 = \frac{\left|S_{ij}(f)\right|^2}{S_{ii}(f)S_{jj}(f)}, \quad i, j = 1, 2, 3, \dots, n.$$
(3)

In these equations, n is the number of response channels,  $S_{ij}$  and  $\gamma_{ij}^2$  are the cross power spectral density and the coherence spectrum corresponding to the *i*th and *j*th channels of the recorded response, respectively; and  $\gamma$  is the Averaged Coherence Spectrum. The ACS intensifies the modal frequencies and plotting it shows a peak around the dominant frequency. Therefore, peaks of the ACS that correspond to the peaks of the first singular value spectrum and which also have their spectral domain near unity, have a strong assurance of corresponding natural frequencies.

## 6.2. Stabilization diagram

Stabilization diagram is widely used as a robust tool to distinguish the true modes from spurious modes. The technique (stabilization criterion) is based on subspace methods. For stabilization diagram, the stabilization procedure performs system sequentially for all system orders up to a user-specified maximum. At each step, poles identified at the current system order are compared to poles identified at the previous system order. The criteria for defining a pole as stable were chosen as less than 1 % difference in frequency and 5 % difference in damping with a pole identified with the previous model order [13].

Initially, the peaks of singular value spectra are determined in accordance with the stabilization diagram, and then the selected peaks are evaluated using ACS criterion.

## 7. The results extracted from ambient vibration records

## 7.1. Natural frequencies

The singular value spectra, stabilization diagram and averaged coherence spectrum of structural responses from different stations for north-south direction, corresponding to arrangements A and B, are shown in Figs. 7-12, respectively. The results of other arrangements

#### are presented in Table 2.





**Fig. 8.** Stabilization diagram obtained from velocities recorded in stations of arrangement A for stream direction



Fig. 9. First singular value spectrum and ACS of responses, for arrangement A







The frequencies extracted from the first singular value spectrum of the responses are shown for two cases A and B, in Figs. 9 and 12, respectively. Iterative similar frequencies appeared in the results of different arrangements A to F are considered as possible natural frequencies of the arch dam. The frequencies are presented in Table 2.

According to the stabilization diagram and ACS criterion calculated from the records of all arrangements, it can be concluded that the first to fourth modes have a higher certainty. In the following, mode shapes and damping ratios relating to the four modes are presented.



Fig. 12. First singular value spectrum and natural frequencies extracted from it, for arrangement B

Madaa Natural frequencies (H			ies (Hz) f	from various arrangements			Maan
Modes	Α	В	С	D	Е	F	Wiean
1	2.380	2.209	2.283	2.173	2.209	2.271	2.254
2	2.783	2.612	2.795	2.795	_	2.722	2.741
3	3.137	3.308	3.113	3.113	3.125	3.125	3.154
4	3.662	3.711	3.669	3.735	3.748	3.735	3.710
5	4.138	4.199	4.248	4.297	4.297	4.285	4.244
6	4.614	4.578	4.773	4.639	4.712	4.590	4.653
7	5.237	5.115	5.127	5.115	5.127	5.151	5.145
8	5.811	5.627	_	5.737	5.823	5.676	5.735
9	6.238	6.335	6.262	6.311	6.323	6.250	6.287

Table 2. Natural frequencies of Karun IV dam

# 7.2. Mode shapes

Singular vectors corresponding to the peaks of the first singular value are used to approximate the mode shape vectors. Mode shapes obtained from the crest level responses (arrangement A) are shown in Fig. 13.



It is important to note that mode shapes obtained from OMA methods (output only techniques)

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are always unscaled. The values of mode shapes relating to the above figure are presented in Table 3.

S+		shapes		
51.	1th mode	2th mode	3th mode	4th mode
4	-0.988814	-0.098406	-0.135167	-0.933428
3	-1.000000	-0.139653	0.125273	0.362004
1	-0.513071	1.000000	1.000000	0.898133
5	-0.588519	0.235745	0.131644	1.000000

Table 3. The mode shape vectors for four first vibration modes

#### 7.3. Damping ratios

In the FDD-WT method, damping ratios can be obtained using both the HPB (half-power bandwidth) and the LD (logarithmic decrement) techniques. In this paper, the half-power bandwidth technique (HPB) is applied to single frequency signals (skeletons) obtained from a continuous wavelet transform. Figs. 14 and 15 show the approach of damping estimation using the FDD-WT method for the third mode. It has been calculated based on the crest level responses (arrangement A).

The damping ratios obtained from FDD-WT method are presented in Table 4. The third mode is strong and clear in spectra from all arrangements; therefore, damping results corresponding to the mode is coherent and closely.





Fig. 15. Damping estimation of the third mode using the skeleton extracted from Fig. 14, based on HPBT

Tuble II Dumping fution extracted from Th DT					
A	Damping ratios (%)				
AIT.	1th mode	2th mode	3th mode	4th mode	
Α	4.71	3.52	3.22	2.97	
В	4.62	4.13	3.23	2.71	
С	5.53	3.99	3.24	3.02	
D	5.05	4.18	3.24	2.87	
Е	5.13	-	3.24	2.96	
F	5.22	4.23	3.23	2.89	
Mean	5.04	4.01	3.23	2.90	

 Table 4. Damping ratios extracted from HPBT

## 8. The results extracted from seismic records

#### 8.1. Natural frequency

The singular value spectra, stabilization diagram and averaged coherence spectrum of

acceleration responses obtained from north-south channels of stations 1 and 2 at crest level (Fig. 3) are shown in Figs. 16-18, respectively.





Fig. 16. Singular values of the cross power spectral density matrix obtained from the accelerations recorded in north-south channels of stations 1 and 2 at crest level

Fig. 17. Stabilization diagram obtained from the accelerations recorded in north-south channels of stations 1 and 2 at crest level



Fig. 18. First singular value and averaged coherence spectra obtained from seismic responses recorded at crest level (north-south channels of stations 1 and 2)

The values of natural frequencies obtained from different channels are presented in Table 5. Comparison of the results indicates that the frequency values obtained from seismic records are similar to the results of ambient vibration test (Table 6).

Comparison of the results relating four first modes is presented in Table 6.

Modes Natural frequencies from the north-south channels of different static				erent stations	Maam
widdes	1 and 2 (crest)	1 to 3	1 to 4	1 to 5	Ivicali
1	2.393	2.393	2.344	2.344	2.369
2	2.734	2.734	2.734	2.734	2.734
3	3.418	3.418	3.418	3.320	3.394
4	3.906	3.906	3.906	3.809	3.882
5	4.150	4.150	4.150	4.199	4.162
6	4.639	4.639	4.639	4.590	4.627
7	5.078	5.078	5.127	5.078	5.090
8	5.615	5.615	5.615	5.566	5.603
9	6.250	6.250	6.250	6.250	6.250

Table 5. Natural frequencies obtained from seismic records

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Modes	Natural frequency (Hz)			
	Ambient vibration test	3 March 2015 earthquake		
1	2.254	2.369		
2	2.741	2.734		
3	3.154	3.394		
4	3.710	3.882		

 Table 6. Comparison of frequency results obtained from the ambient and seismic records

## 8.2. Mode shapes

Mode shapes relating to the peaks of the first singular value obtained from seismic records are shown in Fig. 19. These mode shapes belong to stations 1 and 2 at crest level. Fig. 20 shows comparison of mode shapes obtained from seismic and ambient records for three first modes.



#### 8.3. Damping ratios

Figs. 21-24 show the damping estimation relating to first and third modes using the FDD-WT method. They have been calculated based on output responses of the crest level.



Comparison of damping ratios obtained from ambient and seismic records are indicated in Table 7. The results indicate that the damping ratios obtained from ambient and seismic records have a good agreement.

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Fig. 23. CWT of autocorrelation function relating to the crest level responses (stations 1 and 2) and extraction of ridge and skeleton of the third mode

Fig. 24. Damping estimation of the third mode using the skeleton extracted from Fig. 25, based on HPBT

Table 7. Comparison of damping results obtained from the ambient and seismic records

Madag	Damping ratios (%)		
woulds	Ambient vibration test	3 March 2015 earthquake	
1	5.04	4.71	
2	4.01	4.13	
3	3.23	3.05	
4	2.90	3.10	

#### 9. Conclusions

Comprehensive ambient vibration tests on Karun IV arch dam, the highest concrete arch dam in Iran, performed with six different arrangements of sensors. The non-parametric FDD-WT method is used for signal processing of ambient and seismic records. Nine natural frequencies are obtained from ambient vibration tests. Stabilization diagram and ACS criterion are used to detect true modes from spurious modes. Four natural frequencies are obtained from the seismic responses of the dam during 3 March 2015 earthquake. These values have a good consistency with the results obtained from ambient vibration tests. The corresponding mode shapes and damping ratios for consistent modes are obtained and compared. Good agreement was obtained from both ambient and seismic records.

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**Reza Tarinejad** received Ph.D. degree in civil engineering from Tarbiat Modares University, Tehran, Iran, in 2008. Now he is Assistant Professor at University of Tabriz, Tabriz, Iran. His current research interests include earthquake engineering, system identification, structural health monitoring and finite element analysis.



**Kambiz Falsafian** received M.Sc. Degree in Structural Engineering from University of Guilan, Rasht, Iran, in 1998. Now he is Ph.D. candidate in civil engineering, University of Tabriz, Iran. His current research interests include system identification, design of hydraulic structures and structural health monitoring.



**Mohammad T. Aalami** received Ph.D. degree in hydraulic science and engineering from University of Tabriz, Tabriz, Iran, in 2004. Now he is Professor in University of Tabriz, Tabriz, Iran. His current research interests include hydraulic engineering and water resources management.



**Mohammad T. Ahmadi** received Ph.D. degree in civil engineering from Tohoko University, Sendai, Japan, in 1988. Now he is Dean and Professor of Tarbiat Modares University, Tehran, Iran. His current research interests include concrete dams design and dynamic analysis, earthquake engineering, fluid-structure interaction and finite element analysis.