Transient safety assessment and risk mitigation strategy of a

hydroelectric generation system

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Abstract: Transient safety assessment of hydroelectric generation systems is a major challenge for

engineers specializing in hydropower stations worldwide. This includes two key scientific issues: the

dynamic risk quantification in multi-factors coupling process, and the indices identification with high

contributions on system stability. This paper presents a new flexible, rapid and affordable dynamic

safety assessment methodology for a hydroelectric generation system. Based on the fuzzy-entropy

comprehensive evaluation method, the dynamic safety level of the system is estimated by means of

probability and the influence contributions of assessment indices on risk operations of the hydroelectric

generation system are also obtained. Moreover, some risk mitigation and maintenance strategies are

finally discussed to reduce dual losses of operation and maintenance in hydropower stations. The

methodology is implemented and validated in an existing hydropower station aiming at a start-up

transient process, which is beneficial to risk warning and maintenance strategy enhancement. In

addition the presented methodology in this paper is not only applied in the start-up transient process

but is also promisingly and appropriate for other large fluctuation transient processes.

**Keywords:** hydroelectric generation system; dynamic safety assessment; transient analysis; risk mitigation; maintenance strategy

#### 1. Introduction

The world energy industry is confronted with dual pressure of economic growth and environmental protection, which drives the transformation of renewable energy development [1-3]. Hydropower, as a clear energy, is becoming of interest globally by governments and society due to its reliability, flexibility and affordable expenses [4-7]. A 2017 Energy Report estimates that the world average hydroelectric generation reached 3930 kilowatt hours, currently supplying 16% of world total electricity and 68% of renewable electricity capacity [8]. The 2018 IHA Report highlights the importance of hydropower in electricity generation, and its worldwide distribution and potential development are shown in Fig. 1 [9]. The International Renewable Energy Agency (IRENA) predicts that the world hydropower capacity will reach 2200 gigawatts by 2030 [10]. Thus, hydropower shows a great potential and thus it is of a significant importance and interest to solve the problem of the energy shortage.

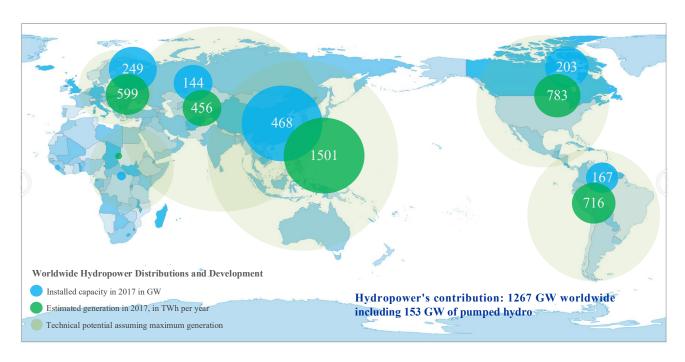


Fig. 1 Worldwide hydropower distributions and potential development [9].

Hydroelectric generation system (HGS) is a hydraulic, mechanical and electrical coupling facility, which is composed of generating unit, penstock system and governing device [11-14]. Under the influence of load disturbances, the HGS faces frequent dynamic state transitions (also called transient processes) with the increase of large capacity generating unit [15-19]. This causes different degrees of components' faults such as piping breaking and abnormal swing of rotor [20-24]. In practice there is an enormous challenge for efficient operation, fault prevention and maintenance forecast in hydropower stations [25-28]. Hence, it is an urgent and important task to assess the dynamic safety of HGSs. To date, some research scholars have attempted to study the HGS's safety from the perspective of independent subsystems like hydraulic subsystem, mechanical subsystem and electrical subsystem, whereas such an approach ignores the nonlinear coupling between subsystems. Additionally, the current method is based on the static HGS, which cannot accurately quantify the dynamic risks of HGSs.

Fuzzy comprehensive evaluation method (FCE) and dynamic entropy-weight method herein are

developed to assess the transient safety of HGSs. FCE is a powerful condition assessment method by means of the theory of fuzzy mathematics, which gives a global evaluation of uncertain system with multiple internal-external factors [29-31]. The entropy-weight method is used to measure the degree of indices' variations, which has been widely applied in various research fields. In this paper, an enhanced dynamic entropy-weight method is proposed to implement the dynamic FCE [32-34]. The dynamic FCE presented in this work realizes the dual estimations of indices' dynamic contributions on system stability and the dynamic safety level during the transient process.

The target of this paper is assessing the transient safety of nonlinear HGSs and its innovation could be summarized in three main points. First, a novel enhanced dynamic fuzzy-entropy evaluation method, combining FCE with dynamic entropy-weight method, is presented to enable the transient safety assessment. It could be stated that the dynamic FCE presented in this work can not only implement the safety assessment of HGSs, but also be applied in other nonlinear complex systems. Second, from the point of view of the entire system, this paper establishes a new safety assessment framework of a hydraulic-mechanical-electrical coupling HGS. This framework aims at the large fluctuation transient processes, such as start-up, shut-down and load rejection, which also realizes the transition from static to dynamic assessment. Third, this paper seeks to provide some corresponding risk mitigation strategies and maintenance enhancement suggestions to improve greatly the dynamic stability of HGS as well as to reduce the operation loss and maintenance loss in hydropower stations.

# 2. Transient characteristics of hydroelectric generation system

The hydroelectric generation system (HGS) efficiently uses the hydropower to generate electricity and transmits the electricity to power grid, thus it is very important to ensure and evaluate its safety

and operation in steady states and especially in transient processes. A universal HGS is composed of reservoir, piping system, surge tank, hydro-turbine, generator and control system, as shown in Fig. 2.

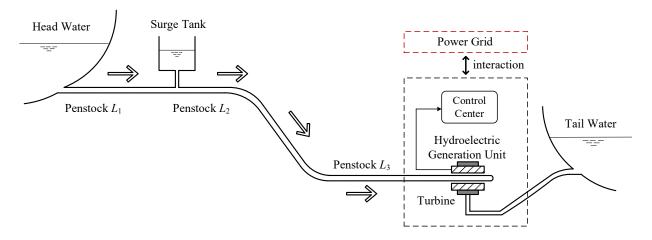


Fig. 2 A structure of a hydroelectric generation system.

In this work, we focus on the risk assessment of HGS in start-up transient process since it is one of the most commonly occurring operating process. During the start-up transient process, the guide vane opening increases in terms of three-segment law performed as in Fig. 3. This results in the pressure pulsation of the flow in pipes and the considerable increase of turbine torque, which greatly deteriorates the safety of HGS.

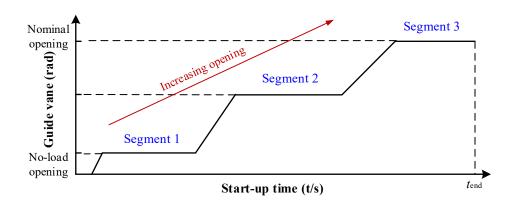


Fig. 3 The three-segment opening law of guide vane in the start-up transient process.

Based on Fig. 3, the dynamic characteristics of HGS in the start-up transient process is expressed by the turbine torque  $M_t$  and the pipe flow Q, i.e.,

$$\begin{cases}
M_t = M_t(H, n, y) \\
Q = Q(H, n, y)
\end{cases}$$
(1)

where H, n and y denote the hydro-turbine head, the hydro-turbine speed and the guide vane opening, respectively.

In light of ref. [19], Eq. (1) can be further obtained as:

$$\begin{cases}
Q = \frac{\omega r_0^2 + \frac{9.8\eta H}{\omega}}{\frac{ctg\alpha}{2\pi b_t} + r_0 \frac{ctg\beta_0}{F}}, \\
M_t = Q \left[ \left( \frac{ctg\alpha}{2\pi b_t} + r_0 \frac{ctg\beta_0}{F} \right) Q - \omega r_0^2 \right]
\end{cases} , \tag{2}$$

where  $\omega$ ,  $\alpha$ ,  $b_t$ , F,  $r_0$  and  $\beta_0$  denote the generator rotor speed, the guide vane discharge angle, the guide vane height, the runner outlet area, the runner intermediate flow surface radius and the runner intermediate flow surface angle, respectively.

# 3. Methodology

This paper presents an enhanced dynamic fuzzy-entropy evaluation method aiming at assessing the HGS in large fluctuation transient process. This innovative method effectively overcomes the static performance estimations in previous conventional approaches, and its implementation is conducive to risk warning and maintenance schedule enhancement in hydropower stations.

To manage the shortcoming of subjective weights used in participation estimations of dynamic assessment indices, a precise entropy weights method is employed. For a transient HGS, nineteen assessment indices (X1~X19) and three comments of safety levels (Stable, Unstable and Unacceptable) are extracted and their change rules are listed in Table 1. The stable comment means that the HGS is in a normal working state within unavoidable vibrations and noises. The unstable comment is defined

as the relative harsh operating condition that is able to have negative impact on operators and the residual operating life of HGS. The unacceptable comment refers to the immediate risk accident, causing operation loss and maintenance loss in hydropower stations.

Table 1 Assessment principle for indices of the HGS

Comment level	X1, X2, X3	X4, X5, X6, X7	X8, X9	X10, X11, X13, X14, X19	X12, X15	X16	X17, X18
Stable (S)	0~54	0~280	0~350	0~100	0~70	0~35	0~80
Unstable (B)	74~108	320~460	400~525	120~200	90~140	45~70	100~160
Unacceptable (P)	>108	>500	>575	>220	>160	>80	>180

• Indices X1~X3 denote inlet pressure of spiral casing (kPa), pressure of head cover (kPa), and inlet pressure of draft pipe (kPa). Indices X4~X7 are swing of upper guide bearing in x-direction (μm), swing of upper guide bearing in y-direction (μm), swing of lower guide bearing in y-direction (μm). Indices X8~X9 are swing of hydraulic guide bearing in x-direction (μm), and swing of hydraulic guide bearing in y-direction (μm). Indices X10~X12 refer to vibration of upper bracket in x-direction (μm), vibration of upper bracket in y-direction (μm), and vibration of lower bracket in z-direction (μm), vibration of lower bracket in z-direction (μm), vibration of lower bracket in z-direction (μm), vibration of head cover in x-direction (μm), vibration of head cover in x-direction (μm), vibration of head cover in y-direction (μm).

It is expected to mitigate vibrations, swings and pressure pulsation in actual operation of hydropower station, thus all selected m assessment indices belong to the inverse index. If there are n comments of safety levels, the normalization equation for the data of m assessment indices at transient time t (t=[0, t<sub>end</sub>]) is expressed as:

$$r_{ij}(t) = \frac{\max x_{ij}(t) - x_{ij}(t)}{\max x_{ij}(t) - \min x_{ij}(t)}, i=1, 2, ..., m \text{ and } j=1, 2, ..., n$$
(3)

where  $r_{ij}(t)$  is the normalization set of inverse index at transient time t.  $\max x_{ij}(t)$  and  $\min x_{ij}(t)$  denote the maximum and minimum values in allowing interval (see Table 1), respectively.  $x_{ij}(t)$  is the actual data of assessment indices at transient time t.

Based on the entropy theory, then the entropy value of assessment index i at transient time t is obtained as:

$$H_i(t) = \lambda \sum_{i=1}^n r_{ij}(t) \ln r_{ij}(t), i=1, 2, ..., m$$
(4)

where the variable  $\lambda = -\frac{1}{\ln n}$ .

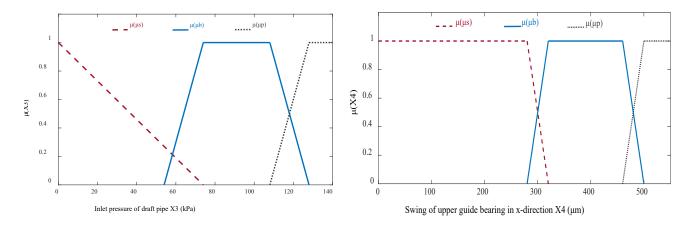
If the normalized index  $r_{ij}(t) = 0$ , then it yields:

$$r_{ii}(t) \ln r_{ii}(t) = 0.$$
 (5)

As a result, the entropy weight set of m assessment indices at transient time t, i.e.  $W(t) = \{\omega_1(t), \omega_2(t), ..., \omega_m(t)\}$ , is calculated by the following equation.

$$\begin{cases}
\omega_{i}(t) = \frac{1 - H_{i}(t)}{m - \sum_{i=1}^{m} H_{i}(t)}, & \omega_{i} \in [0, 1]. \\
\sum_{i=1}^{m} \omega_{i}(t) = 1
\end{cases}$$
(6)

To ensure that the assessment indices  $(X1\sim X19)$  meet  $U=\{u_1, u_2, ..., u_m\}$  and comments of safety levels (Stable-S, Unstable-B and Unacceptable-P) satisfy  $V=\{v_1, v_2, ..., v_n\}$ . Based on classifications of indices and the related change rules in Table 1, the fuzzy membership function of nineteen assessment indices is divided into two types, as shown in Fig. 4. The shape of fuzzy membership function of indices (X1, X2) are similar to index X3, and that of indices  $(5\sim 19)$  are similar to index X4. That is, based on the maximum and minimum of indices  $(X1\sim X19)$  and their corresponding fuzzy membership functions could be finally determined.



(a) Inlet pressure of draft pipe (Index X3) (b) Swing of upper guide bearing in x-direction (Index X4)

Fig. 4 Two types of examples of fuzzy membership functions for assessment indices of the HGS in

#### start-up transient process.

Based on Fig. 4, the fuzzy membership functions of inlet pressure of draft pipe (X3) and swing of upper guide bearing in x-direction (X4) at transient time t are respectively obtained in Eq. (7) and Eq. (8). Besides, the other fuzzy membership functions of assessment indices are performed in Appendix 1.

$$X3: \ \mu_{ij}(V_k)_i = \begin{cases} -\frac{p}{74} + 1, & p \in (-\infty, 74] \\ 0, & others \end{cases}$$

$$\chi_i(\mu_i)_i = \begin{cases} \frac{p}{20} - \frac{27}{10}, & p \in [54, 74) \\ 1, & p \in (74, 108] \\ -\frac{p}{20} - \frac{32}{5}, & p \in (108,) \\ 0, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 108] \\ \frac{p}{20} - \frac{27}{5}, & p \in (108, 128] \\ 1, & others \end{cases}$$

$$\left[ \mu(\mu s) = \begin{cases} 1, & p \in (-\infty, 280] \\ -\frac{p}{40} + 8, & p \in (280, 320] \\ 0, & others \end{cases}$$

$$\chi_i(\mu_i)_i = \begin{cases} \frac{p}{40} - 7, & p \in (280, 320] \\ 1, & p \in (320, 460] \\ -\frac{p}{40} + \frac{25}{2}, & p \in (460, 500] \\ 0, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 460] \\ \frac{p}{40} - \frac{23}{2}, & p \in (460, 500] \\ 1, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 460] \\ \frac{p}{40} - \frac{23}{2}, & p \in (460, 500] \\ 1, & others \end{cases}$$

where  $\mu(\mu s)$ ,  $\mu(\mu b)$  and  $\mu(\mu p)$  are the fuzzy membership functions with respect to Stable

comment, unstable comment and unacceptable comment, respectively.

Subsequently, the fuzzy relationship assessment matrix regarding nineteen indices and three comments of safety levels at time *t* yields:

$$(R_{t_{-}ij})_{m \times n} = \begin{bmatrix} \mu_{11}(u_{1}, v_{1})_{t} & \mu_{12}(u_{1}, v_{2})_{t} & \mu_{13}(u_{1}, v_{3})_{t} \\ \mu_{21}(u_{2}, v_{1})_{t} & \mu_{22}(u_{2}, v_{2})_{t} & \mu_{23}(u_{2}, v_{3})_{t} \\ \mu_{31}(u_{3}, v_{1})_{t} & \mu_{32}(u_{3}, v_{2})_{t} & \mu_{33}(u_{3}, v_{3})_{t} \\ \mu_{41}(u_{4}, v_{1})_{t} & \mu_{42}(u_{4}, v_{2})_{t} & \mu_{43}(u_{4}, v_{3})_{t} \\ \dots & \dots & \dots \\ \mu_{17_{-}1}(u_{17}, v_{1})_{t} & \mu_{17_{-}2}(u_{17}, v_{2})_{t} & \mu_{17_{-}3}(u_{17}, v_{3})_{t} \\ \mu_{18_{-}1}(u_{18}, v_{1})_{t} & \mu_{18_{-}2}(u_{18}, v_{2})_{t} & \mu_{18_{-}3}(u_{18}, v_{3})_{t} \end{bmatrix}_{18 \times 3}$$

Combining Eq. (6) and Eq. (9), the fuzzy-entropy comprehensive assessment matrix at time t is expressed as:

$$A_{t} = (W_{t})_{3 \times 18} \cdot (R_{t \ ii})_{18 \times 3} = \{A_{1t}, A_{2t}, A_{3t}\}. \tag{10}$$

According to maximum membership principle, the adaptive safety level of HGS at time t is  $A_{\max|t=t}$  and meets the condition of  $A_{\max|t=t}$ ,  $A_{\max|t=t} \in A_t$ . Thus, the adaptive comment set of safety levels during the whole start-up transient process is finally calculated as:

$$A_{a} = \{A_{\max|t=1}, A_{\max|t=2}, \dots, A_{\max|t=t_{end}-1}, A_{\max|t=t_{end}}\}.$$
(11)

However, considering both unacceptable comment and unstable comment threaten the safety operation of the HGS, we define a modified comment set of safety levels  $A_c$  that comprehensively takes into account the total probability of the unstable and unacceptable comments.

$$A_c = \{A_{B+P|t=1}, A_{B+P|t=2}, \dots, A_{B+P|t=t_{end}-1}, A_{B+P|t=t_{end}}\}.$$
(12)

The global methodology implemented in this paper is demonstrated in Fig.5.

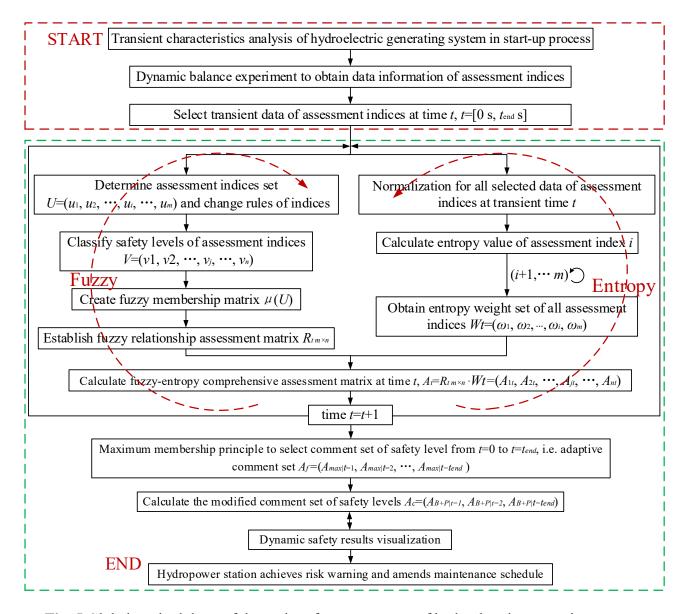


Fig. 5 Global methodology of dynamic safety assessment of hydroelectric generating system.

The calculation process plan is concluded and described in the following steps:

- (1) Carry out dynamic balance experiments on the basis of an existing hydropower station to obtain the start-up transient data of HGS (i.e. indices X1~X19 listed in Table 1). To improve the data reliability, use the analysis results of transient performance characteristics of the HGS to identify and diminish outlier in data.
- (2) Selecting thirteen monitoring times ( $t=t_1\sim t_{end}$ ) referring to the transient time within increasing loads 10MW, 20MW, 30MW and till 130MW to collect data signals of multiple sensors. According to

time priority, evaluate orderly the safety properties of HGS from time  $t_1$  to time  $t_{end}$ .

- (3) To enable the fuzzy-entropy analysis, first determine nineteen assessment indices (i.e.  $X1\sim X19$ ) and three comments of safety levels (i.e. Stable, Unstable and Unacceptable) defined respectively as  $U=\{u_1, u_2, ..., u_m\}$  and  $V=\{v_1, v_2, ..., v_n\}$ . In light of the change rules in Table 1, the fuzzy membership function  $\mu(V)_{t_1\sim t_{end}}$  and fuzzy relationship assessment matrix  $(R_{m\times n})_{t_1\sim t_{end}}$  at different times are respectively obtained as equations (7, 8) and equation (9).
- (4) Calculating the entropy values of normalized assessment indices at the time interval  $t=[t_1, t_{end}]$ , and subsequently deducing the corresponding entropy weight set W(t) in light of equation (6).
- (5) Creating the fuzzy-entropy comprehensive assessment matrices  $A_{t1} \sim A_{tend}$  at different times that can be defined by the product between fuzzy relationship assessment matrix  $(R_{m \times n})_{t_1 \sim t_{end}}$  and entropy weight set W(t). Using maximum membership principle to select the adaptive comment set of safety levels  $A_a = \{A_{\max|t=1}, A_{\max|t=2}, ..., A_{\max|t=t_{end}-1}, A_{\max|t=t_{end}}\}$ . Considering the dual threat of unacceptable and unstable states of the HGS, We define a modified comment set of safety levels  $A_c = \{A_{B+P|t=1}, A_{B+P|t=2}, ..., A_{B+P|t=t_{end}-1}, A_{B+P|t=t_{end}}\}$ . Finally, we visualize the transient safety assessment results of the HGS.
- (6) Based on the analysis results, provide some important risk mitigation strategies and maintenance enhancement suggestions to improve greatly the dynamic safety of HGS and to reduce the losses of operation and maintenance in hydropower stations.

### 4. Experiments

### 4.1 Start-up dynamic balance experiment

To obtain assessment data of the HGS in start-up transient process, dynamic balance experiments

are carried out based on an existing hydropower station in China. The mechanical-electric parameters information [35] and hydraulic testing conditions are listed in Table 2.

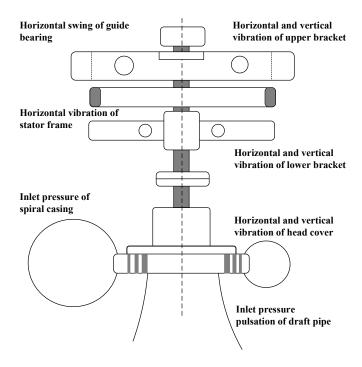
Table 2 Hydraulic-mechanical-electric information of experimental HGS in start-up transient process

Mechanical-electric Parameters Information							
Hydro-turbine type	HLS270-LJ-680	Nominal turbine power	267.85MW				
Nominal turbine head	64m	Nominal turbine flow	460.46m <sup>3</sup> /s				
Nominal turbine speed	93.75rpm	Runaway speed	185rpm				
Generator type	SF265-64/15000	Generator capacity	291.7MVA				
Stator voltage	15750V	Stator current	10692A				
Generator power factor	0.9	Exciting voltage	350V				
Exciting current	1900A	Nominal frequency	50Hz				
Covernor tune	PFWT-200-6.3	Main configuration	200mm				
Governor type	PF W 1-200-0.3	diameter	20011111				
Operating oil pressure	6.3MPa	Servomotor stroke	780mm				
Lower guide bearing	0.15~0.2mm	Upper guide bearing	0.15~0.2mm				
clearance	0.13~0.211111	clearance					
Water guide bearing	0.2~0.25mm	Cylinder diameter of	640mm				
clearance	0.2~0.2311111	servomotor	04011111				
Hydraulic Testing Conditions							
Upstream water level	431.93m	Downstream water level	367.19m				
Opening range of guide	18.5%~50.2%	Maximum active power	130MW				
vane	10.370~30.270	in start-up transient	1 301VI VV				
Actual station head	64.74m						

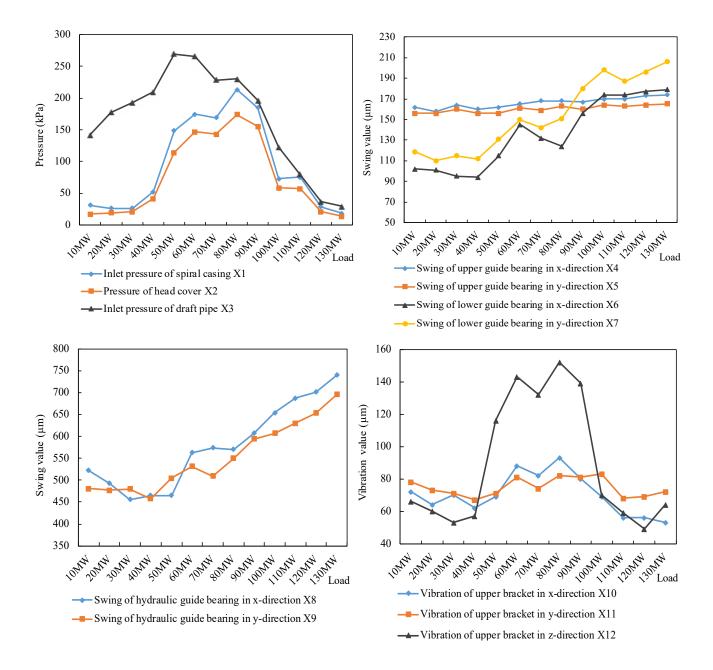
The monitoring targets in the dynamic balance experiment are the indices X1~X19 listed in Table 1. The start-up experimental data are adopted from thirteen transient calculated conditions that refer to the transient times within the corresponding increasing active load of 10MW, 20MW, 30MW, 40MW, 50MW, 60MW, 70MW, 80MW, 90MW, 100MW, 110MW, 120MW and 130MW. The experimental mainframes include PSTA-H vibration instrumentation and TTS216 dynamic signal instrumentation. The key phase patch is attached to the main shaft of generator. Electric eddy-current displacement sensors measure the swing of upper guide bearing in x/y-direction (X4 and X5), the swing of lower guide bearing in x/y-direction (X6 and X7) and the swing of hydraulic guide bearing in x/y-direction

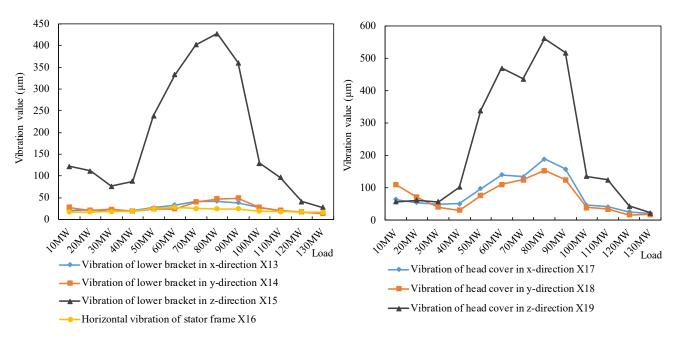
(X8 and X9). Low-frequency shock transducers are used to monitor the horizontal/vertical vibrations of upper bracket, lower bracket, stator frame and head cover (i.e., X10~X19). Water pressure transducers measure the inlet pressure of spiral casing (X1), the pressure of head cover (X2) and the Inlet pressure of draft pipe (X3). Finally, all monitoring data of assessment indices are transmitted and analyzed by experimental mainframes. the measured vibrations and swings (X4~X19) belong to peak-to-peak values. The obtained inlet pressure of spiral casing (X1) is the mean value, and the experimental pressure of head cover (X2) and the inlet pressure of draft pipe (X3) are peak-to-peak values.

The layout of supervision points in the dynamic balance experiment is performed in Fig. 6, and the monitoring data are shown in Fig. 7.



**Fig. 6** Layout of supervision points of the HGS for the start-up transient process in dynamic balance experiment.





**Fig. 7** Experiment data of nineteen assessment indices (X1~X19) of the HGS in start-up transient process.

### 4.2 Preliminary experimental analysis

From the experimental results in Fig. 7, it is observed that some indices exceed the allowable operating ranges (as listed in ref. [35]). Specifically, the peak values of swing of hydraulic guide bearing in x-direction (X8) and swing of hydraulic guide bearing in y-direction (X9) are roughly 710µm and 653µm, respectively. This is almost more than double compared to the allowable operating value of 300µm. The measured inlet pressure of draft pipe (X3) reaches the maximum of 269.5kPa, which is obviously greater than the allowable operating value of 64kPa. Additionally, the instability problems also exist in the inlet pressure of spiral casing (X1), the vibration of upper bracket in z-direction (X12), the vibration of lower bracket in z-direction (X15), the vibration of head cover in x/y/z-direction (X17, X18 and X19).

However, it is difficult to determine the location of risk sources since half of all indices exceed their maximum allowable values. Besides, the complex internal coupling characteristics of different

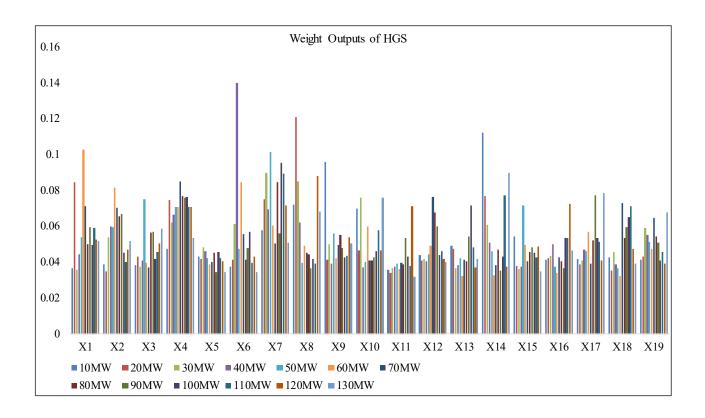
indices cannot be neglected in the transient process. For example, the small change of one index may lead to a dramatic variation of multiple indices. Therefore, to diminish the problems of vibrations, swings and fluctuations, it is necessary and urgent to conduct deep theoretical evaluations to better understand the dynamic operating quality and to eliminate confounding indices in risk determination of the HGS in start-up transient process.

### 5. Dynamic safety analysis and risk mitigation

This section aims to quantitatively analyze the safety levels of the HGS using quantized probabilities. To determine the risk sources of the HGS, the fuzzy-entropy weights of assessment indices during the full load domain (10MW $\sim$ 130MW) are calculated. In addition to this, the risk probability of the HGS based on the adaptive comment set  $A_a$  and the modified comment set  $A_c$  is investigated. In light of the safety assessment results, a number of corresponding risk mitigation strategies and maintenance enhancement suggestions to improve the transient operation of the HGS and to achieve the maximization of asset efficiency in hydropower stations are provided.

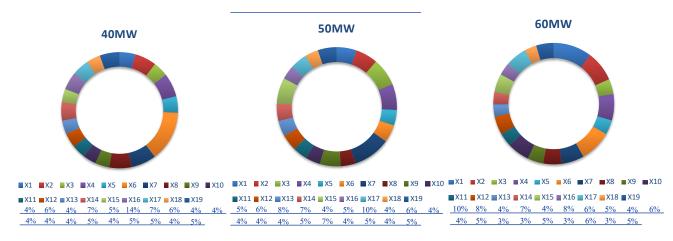
#### 5.1 Index contributions on HGS's risks

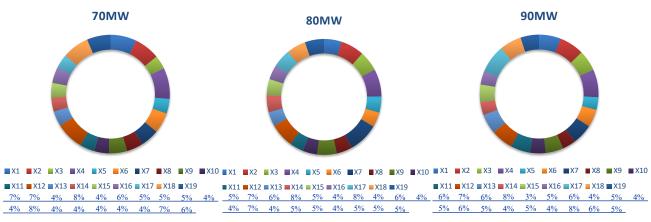
To elaborate the effect of nineteen assessment indices (X1~X19) on dynamic operating quality of the HGS, Fig. 8 is presented to show the visualization results of the interaction of weights, loads and assessment indices in the start-up transient process. Also, Fig. 9 further quantifies the influence contributions of assessment indices (X1~X19) on transient risks of the HGS under different operating conditions within the load of 10MW~130MW.



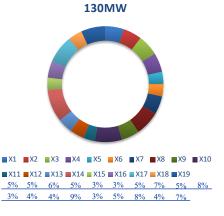
**Fig. 8** Visualization results of the interaction of dynamic weights, increasing loads (10MW~130MW) and assessment indices (X1~X19) of the HGS in start-up transient process.











**Fig. 9** Quantified results of contribution weights of nineteen assessment indices (X1~X19) on HGS's risks for the start-up transient process under different operating conditions within the increasing load of 10MW, 20MW, 30MW, 40MW, 50MW, 60MW, 70MW, 80MW, 90MW, 100MW, 110MW, 120MW and 130MW.

From Fig. 8 and Fig. 9, there are different influence weights of the same index during the full load domain (10MW~130MW), implying that the indices have uncertain risk contributions on the transient HGS. for example, the time-varying weights set of index X1 is [0.0367, 0.0846, 0.0357, 0.0443, 0.0537, 0.1027, 0.0712, 0.05, 0.0595, 0.0494, 0.0589, 0.0526, 0.0518] with respect to the increasing load from 10MW to 130MW. Moreover, for the same load condition, the indices X1~X19 develops within the mutual effect and restriction as the system load continuously increases. This means that almost all indices have a high sensibility to the risk contribution of leading indices at different dynamic risk evolution stages. Additionally, it is easy to find that the critical indices with prominent high risk contributions roughly include the inlet pressure of spiral casing (X1), swing of lower guide bearing in x-direction (X6), swing of lower guide bearing in y-direction (X7), swing of hydraulic guide bearing in x-direction (X8), swing of hydraulic guide bearing in y-direction (X9) and vibration of lower bracket in y-direction (X14).

### 5.2 Transient safety assessment of HGS

Based on equation (11), Fig. 10 presents the adaptive comment set of HGS's safety levels (i.e.  $A_a$ ) to reflect the probabilities of stable, unstable and unacceptable operating states in the start-up transient process. Based on equation (12), the modified comment set (i.e.  $A_c$ ) is shown in Fig. 11 to reveal the dual adverse effect of the unstable state and unacceptable state on the transient HGS.

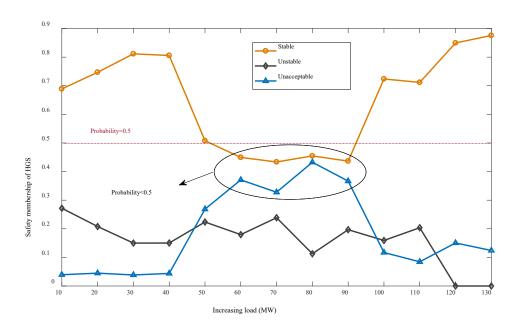


Fig. 10 Dynamic safety levels of the HGS obtained from the adaptive comment set  $A_a$  in the start-up transient process.

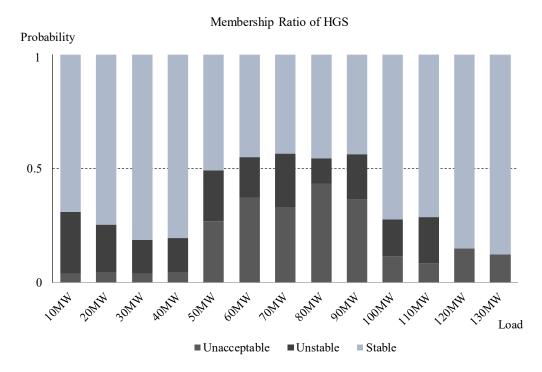


Fig. 11 Enhanced dynamic safety levels of the HGS obtained from the modified comment set  $A_c$  in the start-up transient process.

As shown in Fig. 10, all final adaptive comments for safety levels of the transient HGS under different load conditions are judged to be stable on the basis of the maximum membership principle.

Almost all stable probabilities of the HGS excepting the probabilities in the load interval [50MW, 90MW] are greater than 0.5. Simultaneously, it is observed that the stable probabilities are close to unstable probabilities in the load interval [50MW, 90MW]. This alerts the operators to pay more attention to the occurrence of large vibrations and loud noises or even the start-up failures. It is worth noting that the maximal unacceptable probability (0.0394) occurs at the load of 10MW, which means that the major risk is highly likely to occurs at the beginning stage of the transient process. Conversely, the maximal stable probability is 0.8893, revealing that the HGS is able to connect to the electric power grid safely.

Fig. 11 clearly performs the total unexpected probability of unstable comment and unacceptable comment under different operating conditions within the increasing load of 10MW~130MW. The combined probability is extremely close to the value of 0.5 at the load of 50MW, and the combined probabilities are greater than the value of 0.5 during the load range of [60MW, 90MW]. This should draw hydropower station's attention to the occurrence of instability problems during this load domain.

### 5.3 Risk mitigation and maintenance strategies

The operating target of hydropower stations is to reduce avoidable risks, to avoid additional costs of power production and to coordinate maintenance schedules of workers. All of these targets are able to be achieved by improving the HGS's safety operation in transient processes. In this research work, the above transient safety assessment results can give the guidance to the enhancements of risk mitigation strategies and maintenance strategies in hydropower stations. Correspondingly, the detailed suggestions are summarized as follows:

i) The operators should be concerned with the working condition of the HGS in the load domain

[50MW, 90MW], monitoring timely risk indices to generate effective warning strategies to avoid failure accidents. The hydropower station develops urgent maintenance procedures to realize the goal of loss-aversion. Meanwhile, it is better for maintenance workers to pay more attention to the faults location during the next maintenance period if the warning strategies and maintenance procedures are entirely ineffective.

- ii) Aiming at the situation that the high risk occurs at the early stage of the start-up transient process, it is suggested that the operating planners optimize the start-up strategy such as the optimization of guide vane law and the reduction of misoperation frequency. Additionally, the hydropower station should arrange repair plans to manage with potential adverse accidents.
- iii) The final assessment comment of the HGS's dynamic operating quality is stable, although we cannot exclude the occurrence of potential unstable and unacceptable events. Based on this comment, the hydropower is able to extend the maintenance period or change its regular time-based maintenance strategy to condition-based maintenance strategy to optimize the maintenance schedule of workers and to minimize the maintenance loss.

### 6. Conclusions

This paper evaluates the transient safety quality of the HGS, providing contributions to the current international pool of dynamic safety knowledge compared with the conventional static safety assessment of HGSs. To achieve the analysis, it first develops an enhanced fuzzy-entropy evaluation approach to enable the dynamic risk quantification based on the assessment indices obtained by dynamic balance experiments and corresponding theory modifications. The calculated dynamic weights of indices reveal their influence contributions on instability of the HGS. Then finds that the

critical indices with prominent high risk contributions for the start-up transient process roughly include the inlet pressure of spiral casing (X1), swing of lower guide bearing in x-direction (X6), swing of lower guide bearing in y-direction (X7), swing of hydraulic guide bearing in x-direction (X8), swing of hydraulic guide bearing in y-direction (X9) and vibration of lower bracket in y-direction (X14). Additionally, the transient safety levels for the full load domain (10MW, 130MW) are successfully estimated, and the assessment results show that the final evaluation comment of safety quality for the start-up transient HGS is stable, although it cannot be excluded the potential unstable and unacceptable events. The hydropower stations will pay more attention to operating states of the HGS in the load interval [50MW, 90MW] since the stable probabilities are close to unstable probabilities. Simultaneously, the dynamic safety status at the early stage of the transient process is also required to pay special attention because the relevant maximal unacceptable probability reaches 0.0394. Finally, aiming at the results of the quantitative calculation and qualitative analysis, it presents some corresponding responses of risk mitigation strategies and maintenance amending suggestions to improve greatly the transient safety quality of HGS, to reduce the loss of power production and to optimize maintenance schedules of workers in hydropower stations. Our future work will focus on the application of the proposed methodology in the safety assessment of other large fluctuation transient processes (e.g. load rejection, generating phase modulation and operation switching between different transient processes).

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# Appendix 1

Fuzzy membership functions of nineteen assessment indices (i.e. X1~x19) are calculated as:

$$\mu(\mu s) = \begin{cases} -\frac{p}{74} + 1, & p \in (-\infty, 74] \\ 0, & others \end{cases}$$

$$(X1 \sim X3): \quad \mu_{ij}(V_k)_t = \begin{cases} \frac{p}{20} - \frac{27}{10}, & p \in [54, 74) \\ 1, & p \in (74, 108] \\ -\frac{p}{20} - \frac{32}{5}, & p \in (108,) \\ 0, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 108] \\ \frac{p}{20} - \frac{27}{5}, & p \in (108, 128] \\ 1, & others \end{cases}$$

$$(13)$$

$$(X4-X7): \ \mu_{y}(V_{k})_{t} = \begin{cases} 1, & p \in (-\infty, 280] \\ -\frac{p}{40} + 8, & p \in (280, 320] \\ 0, & others \end{cases}$$

$$(X4-X7): \ \mu_{y}(V_{k})_{t} = \begin{cases} \frac{p}{40} - 7, & p \in (280, 320] \\ 1, & p \in (320, 460] \\ -\frac{p}{40} + \frac{25}{2}, & p \in (460, 500] \\ 0, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 460] \\ \frac{p}{40} - \frac{23}{2}, & p \in (460, 500] \\ 1, & others \end{cases}$$

$$\left\{ \mu(\mu s) = \begin{cases} 1, & p \in (-\infty, 350] \\ -\frac{p}{50} + 8, & p \in (350, 400] \\ 0, & others \end{cases}$$

$$\left\{ \mu(\mu b) = \begin{cases} \frac{p}{50} - 7, & p \in (350, 400] \\ 1, & p \in (400, 525] \\ -\frac{p}{50} + \frac{23}{2}, & p \in (525, 575] \\ 0, & others \end{cases} \right\}$$

$$\left\{ \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 525] \\ \frac{p}{50} - \frac{21}{2}, & p \in (525, 575] \\ 1, & others \end{cases} \right\}$$

$$\left\{ \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 525] \\ \frac{p}{50} - \frac{21}{2}, & p \in (525, 575] \\ 1, & others \end{cases} \right\}$$

$$(X10, X11, X13, X14, X19): \ \mu_{y}(V_{k})_{i} = \begin{cases} 1, & p \in (-\infty, 100] \\ -\frac{p}{20} + 6, & p \in (100, 120] \\ 0, & others \end{cases}$$

$$(X10, X11, X13, X14, X19): \ \mu_{y}(V_{k})_{i} = \begin{cases} \frac{p}{20} - 5, & p \in (100, 120] \\ 1, & p \in (120, 200] \\ -\frac{p}{20} + 11, & p \in (200, 220] \\ 0, & others \end{cases}$$

$$\left\{ \begin{array}{l} \mu(\mu p) = \begin{cases} 1, & p \in (-\infty, 70] \\ -\frac{p}{20} + \frac{9}{2}, & p \in (70, 90] \\ 0, & others \end{cases} \right.$$

$$\left\{ \begin{array}{l} \mu(\mu s) = \begin{cases} 1, & p \in (-\infty, 70] \\ -\frac{p}{20} + \frac{9}{2}, & p \in (70, 90] \\ 0, & others \end{cases} \right.$$

$$\left\{ \begin{array}{l} \mu(\mu b) = \begin{cases} \frac{p}{20} - \frac{7}{2}, & p \in (70, 90] \\ 1, & p \in (90, 140] \\ 0, & others \end{cases} \right.$$

$$\left\{ \begin{array}{l} \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 140] \\ \frac{p}{20} - 7, & p \in (140, 160] \\ 1, & others \end{cases} \right. \end{cases}$$

$$\left\{ \begin{array}{l} \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 140] \\ \frac{p}{20} - 7, & p \in (140, 160] \\ 1, & others \end{cases} \right. \end{cases}$$

$$X16: \ \mu_{q}(V_{k})_{t} = \begin{cases} 1, & p \in (-\infty, 35] \\ -\frac{p}{10} + \frac{9}{2}, & p \in (35, 45] \\ 0, & others \end{cases}$$

$$X16: \ \mu_{q}(V_{k})_{t} = \begin{cases} \frac{p}{10} - \frac{7}{2}, & p \in (35, 45] \\ 1, & p \in (45, 70] \\ -\frac{p}{10} + 8, & p \in (70, 80] \\ 0, & others \end{cases}$$

$$\mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 70] \\ \frac{p}{10} - 7, & p \in (70, 80] \\ 1, & others \end{cases}$$

$$\left\{ \mu(\mu s) = \begin{cases} 1, & p \in (-\infty, 80] \\ -\frac{p}{20} + 5, & p \in (80, 100] \\ 0, & others \end{cases}$$

$$\left\{ \mu(\mu s) = \begin{cases} \frac{p}{20} - 4, & p \in (80, 100] \\ 1, & p \in (100, 160] \\ -\frac{p}{20} + 9, & p \in (160, 180] \\ 0, & others \end{cases} \right.$$

$$\left\{ \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 160] \\ \frac{p}{20} - 8, & p \in (160, 180] \\ 1, & others \end{cases} \right.$$

$$\left\{ \mu(\mu p) = \begin{cases} 0, & p \in (-\infty, 160] \\ \frac{p}{20} - 8, & p \in (160, 180] \\ 1, & others \end{cases} \right.$$

$$\left\{ 1, & 0, 0 \end{cases}$$

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